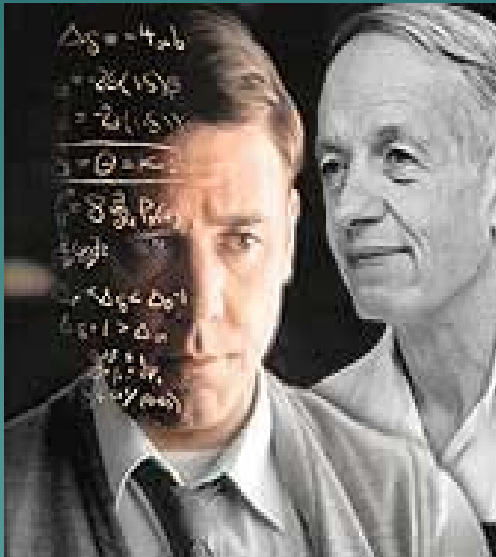


# Transdisciplinary Imaging Genetics Center

Steven G. Potkin  
UC Irvine

# Schizophrenia as a model



## ◆ Schizophrenia

- Brain illness with subtle structural and functional changes
- Active area of imaging research with many competing theories and approaches

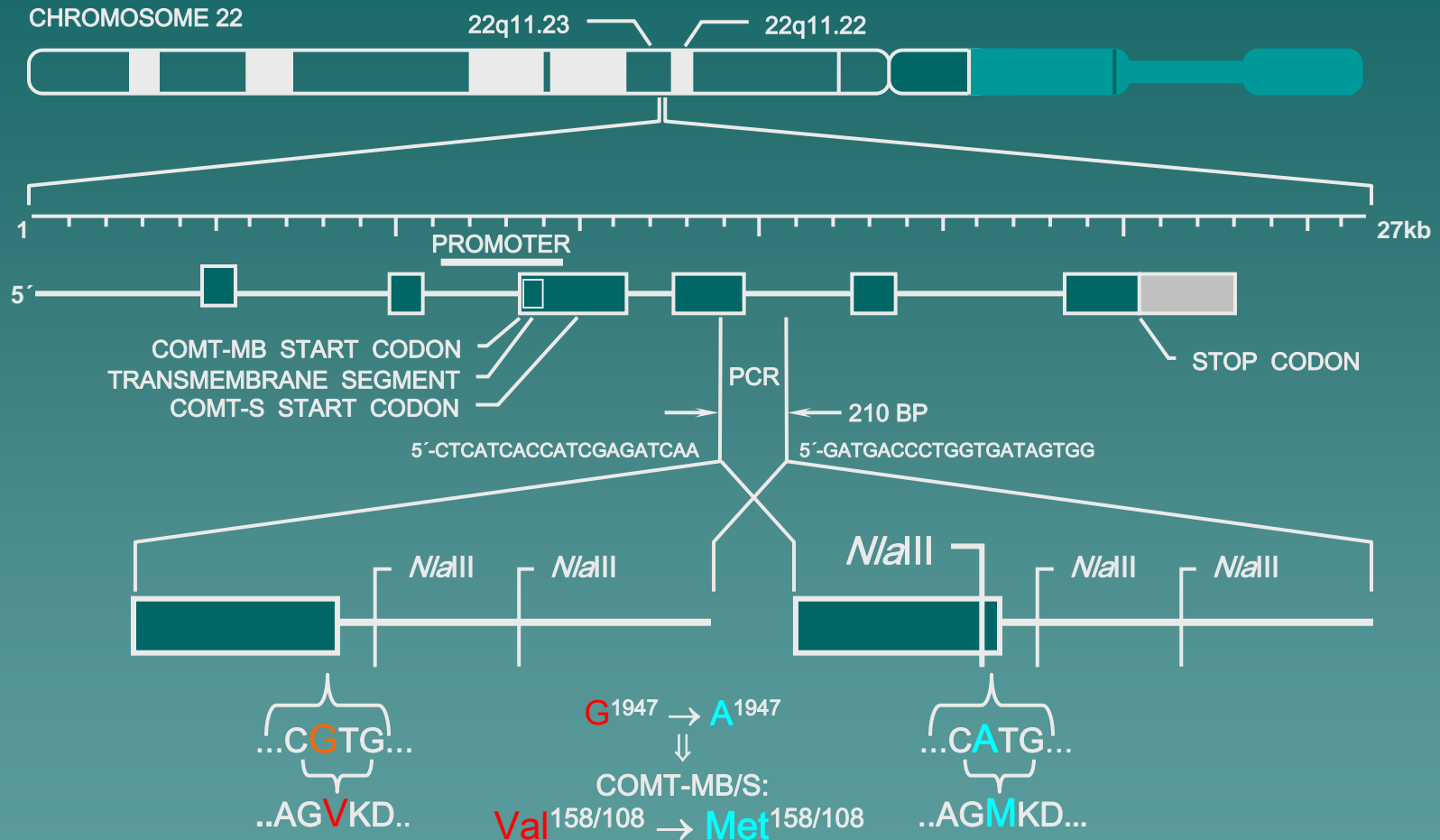
## ◆ Progress hampered by

- Inconsistent data & lack of replications
- Noncomparable imaging techniques
- Small and diverse patient populations

# The problem

- ◆ Schizophrenia is highly heritable
- ◆ No single gene
- ◆ Believed to be:
  - Multigenetic
  - Each with a small contribution
- ◆ How do you identify the genes and determine their influence on behavior?

# The COMT Gene



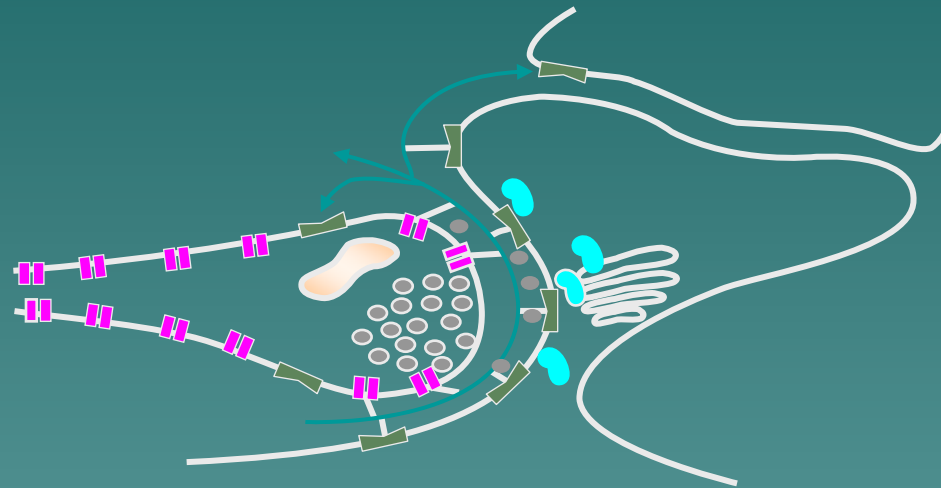
**high-activity (3-4X)**  
thermo-stable  
**Low Dopamine Available**

**low-activity (1X)**  
thermo-labile  
**More Dopamine Available**

SOURCE: NCBI, GEN-BANK, ACCESSION # Z26491

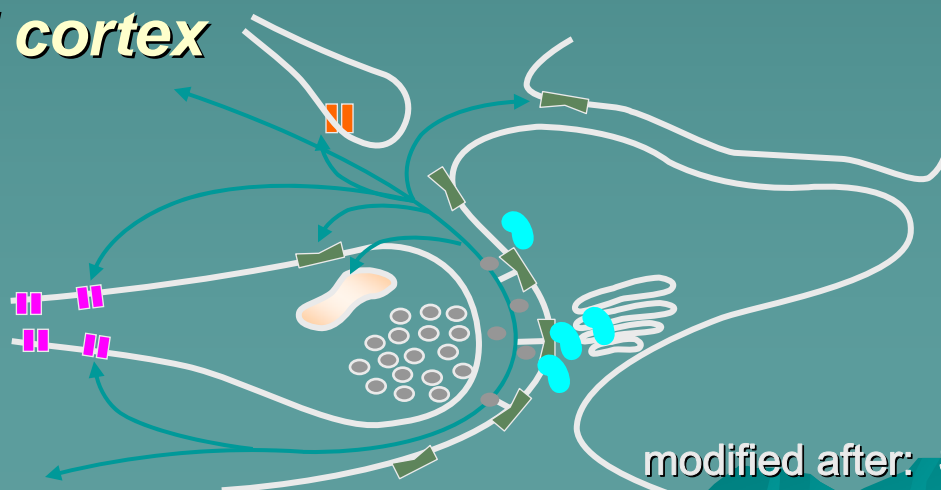
# Dopamine terminals in striatum and in prefrontal cortex are not the same

## Striatum



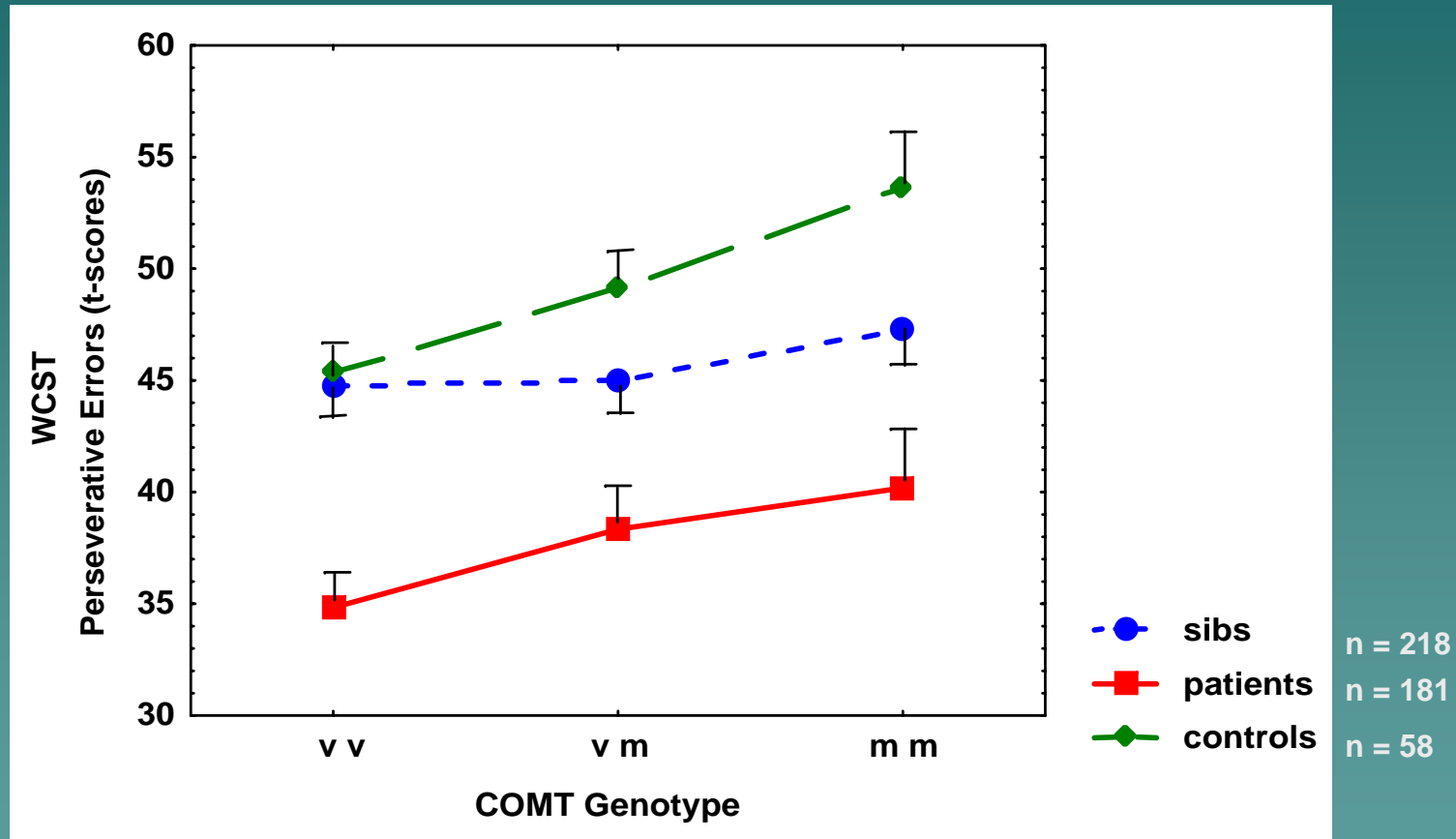
- DA
- DA transporter
- DA receptor
- COMT
- NE transporter

## Prefrontal cortex



modified after: Sesack et al *J. Neurosci* 1999  
Weinberger, ICOSR, 2003

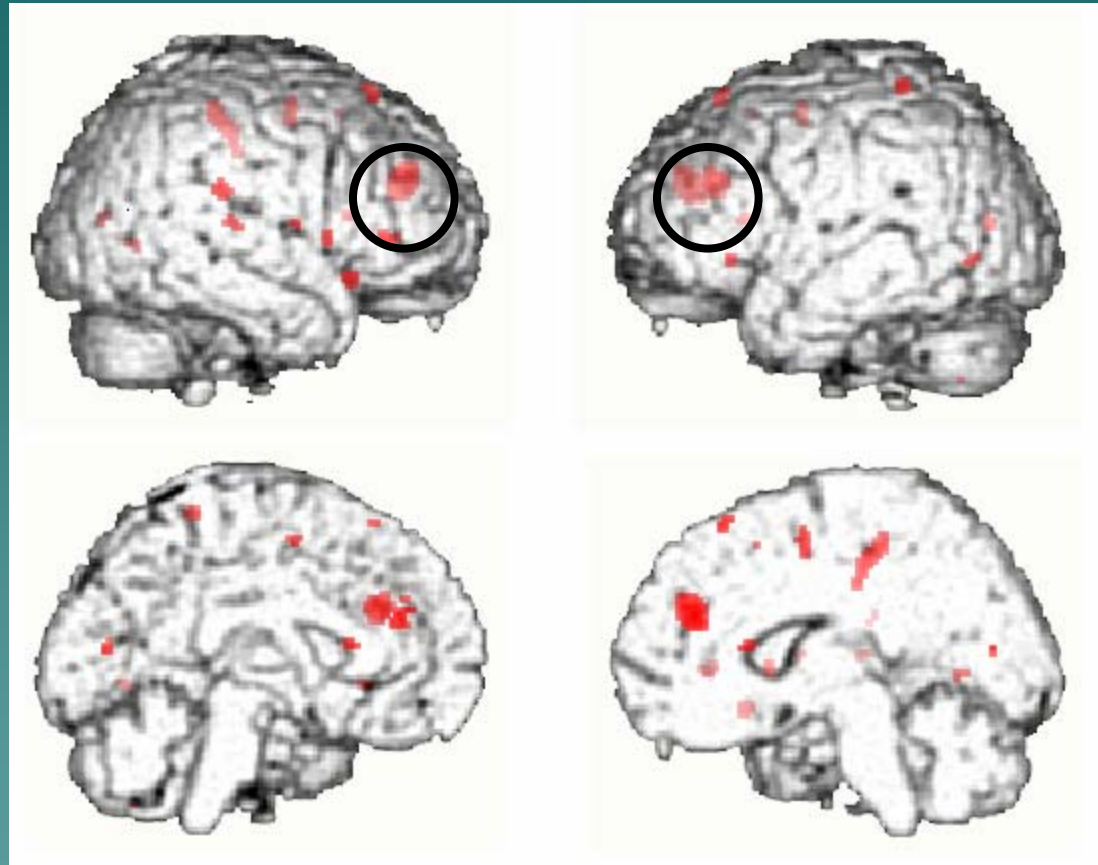
# Example: COMT Genotype Effects Executive Function



Genotype Effect ( $F=5.41$ ,  $df= 2, 449$ );  
 $p<.004$ .

Egan et al *PNAS* 2001

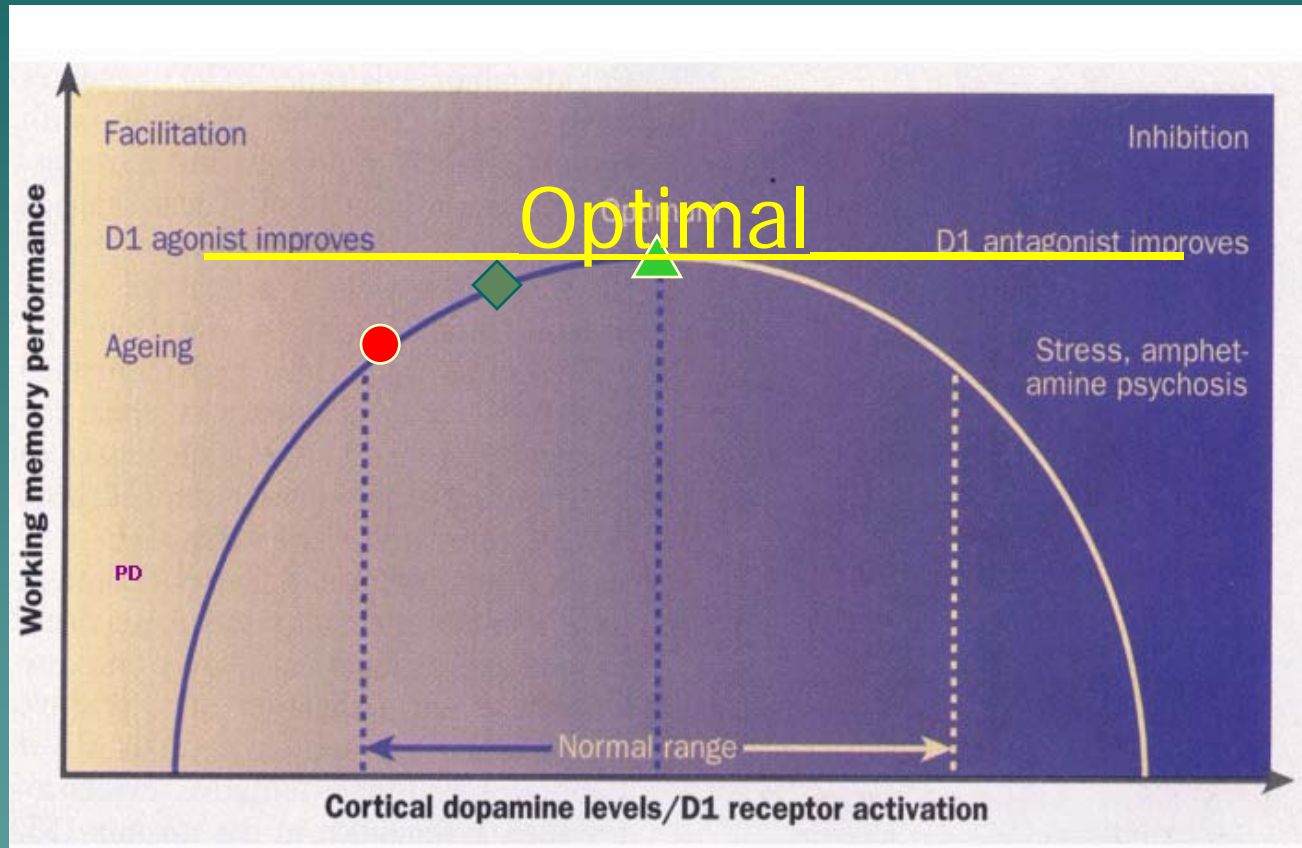
# COMT Genotype and Cortical Efficiency During fMRI Working Memory Task



Val-val>val-met>met-met use more DLPFC to do same task, SPM 99,  $p < .005$

Egan et al *PNAS* 2001

# Predicted relative effects of COMT genotype on prefrontal cortical function



Arnsten and Goldman-Rakic, 1986  
Arnsten et al., 1994  
Murphy et al., 1994, 1996 a,b, 1997  
Williams and Goldman-Rakic, 1995  
Verma and Moghaddam, 1996

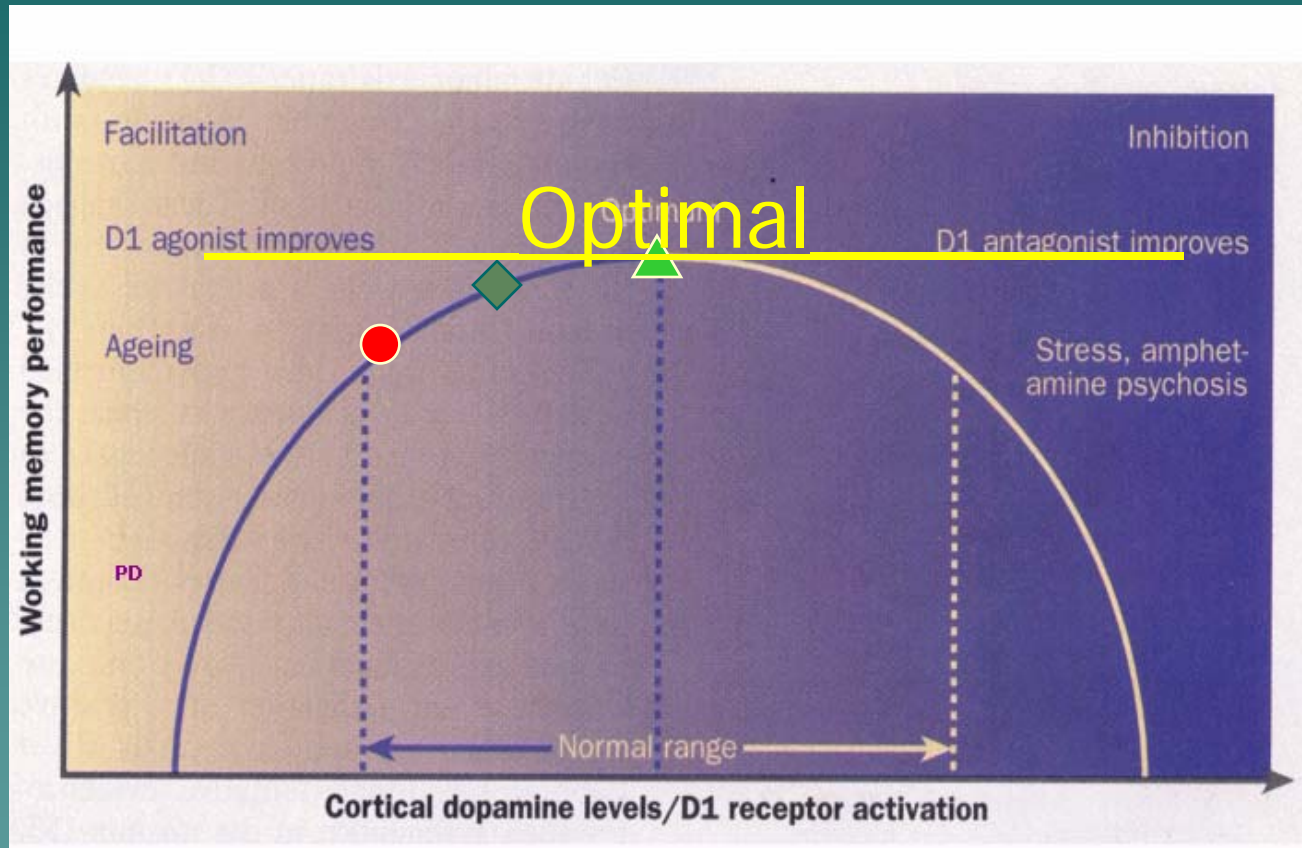
'VV' - high COMT activity  
LOW synaptic dopamine

'mm' - low activity  
HIGH synaptic dopamine

'Vm' - intermediate



# Predict that DRD1 genotype will influence prefrontal cortical function



Arnsten and Goldman-Rakic, 1986  
Arnsten et al., 1994  
Murphy et al., 1994, 1996 a,b, 1997  
Williams and Goldman-Rakic, 1995  
Verma and Moghaddam, 1996

'VV' - high COMT activity  
LOW synaptic dopamine

'mm' - low activity  
HIGH synaptic dopamine

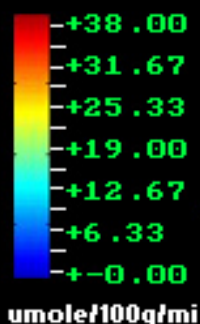
'vm' - intermediate

# Metabolic Changes with Clozapine by D1 Alleles

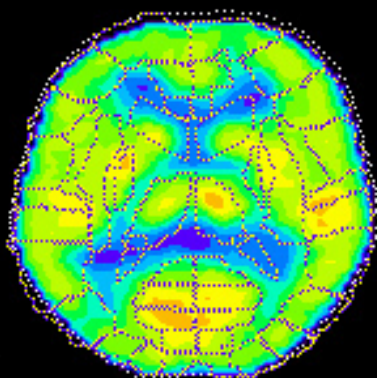
MHS 8

**AA  
Allele 22**

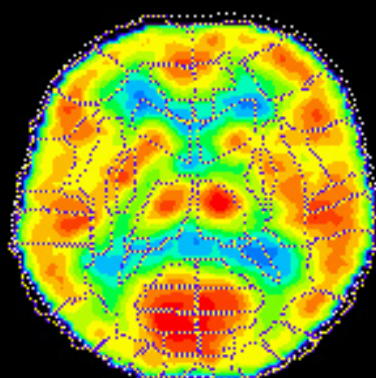
n=7



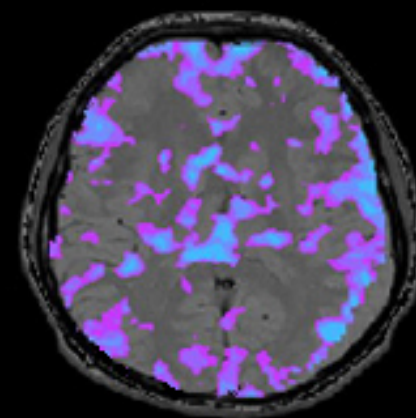
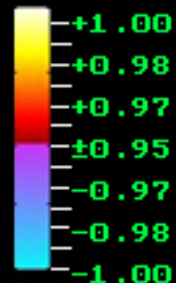
Clozapine



Baseline

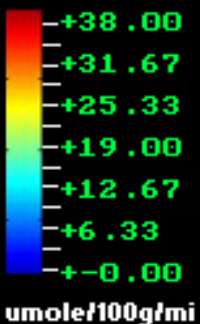


Clozapine-Baseline  
BPRSpos = 30% Improvement

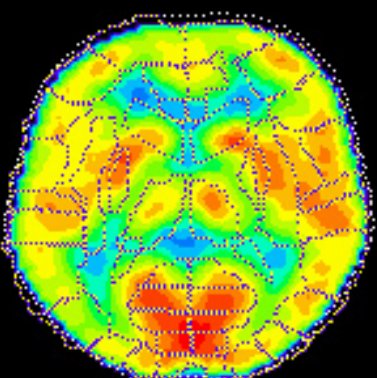


**AT  
Allele 12**

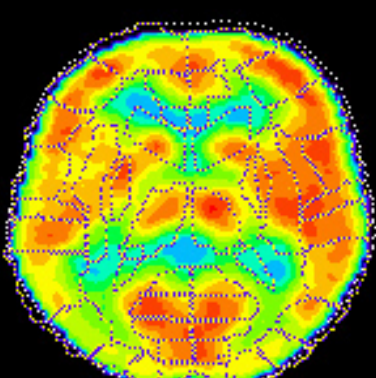
n=8



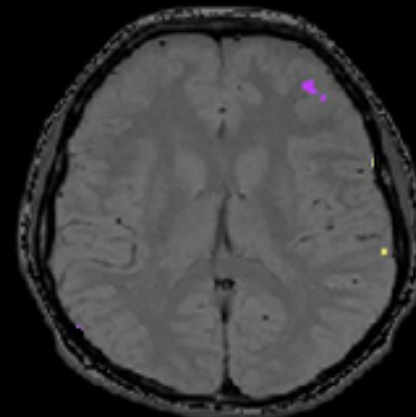
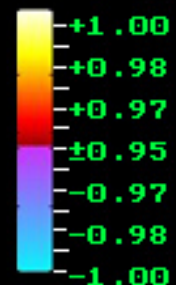
Clozapine



Baseline



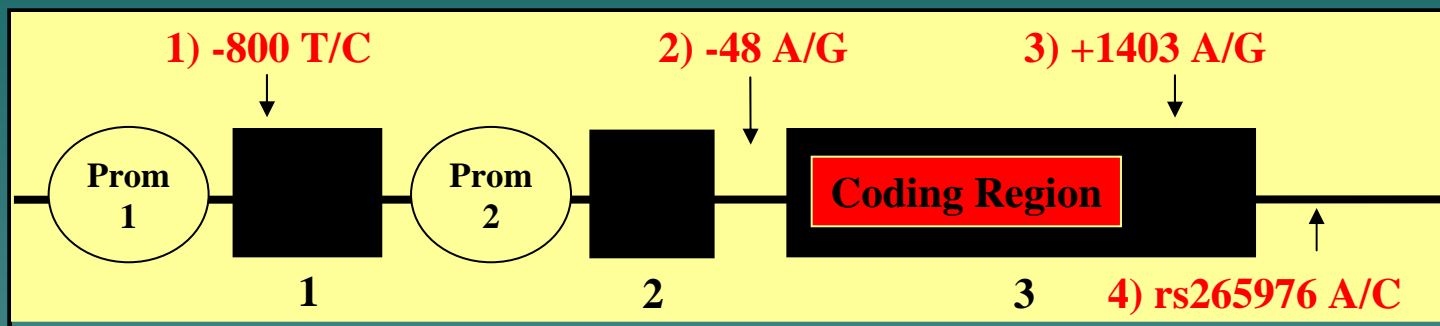
Clozapine-Baseline  
BPRSpos = 7% Worsening



p-map (95%)

Potkin et al ,2003

# ***DRD1 Polymorphisms in Clozapine Response (N=234)***



Ethnicity	Global P Value	Haplotype	Responder: n (Est. Freq.)	Non-Responder: n (Est. Freq.)	P Value
Caucasian	0.616	1-2-1-2	0.9 (0.01)	5.7 (0.02)	0.016
African-American	0.189	1-2-2-2	3.0 (0.06)	0.0 (0.00)	0.042

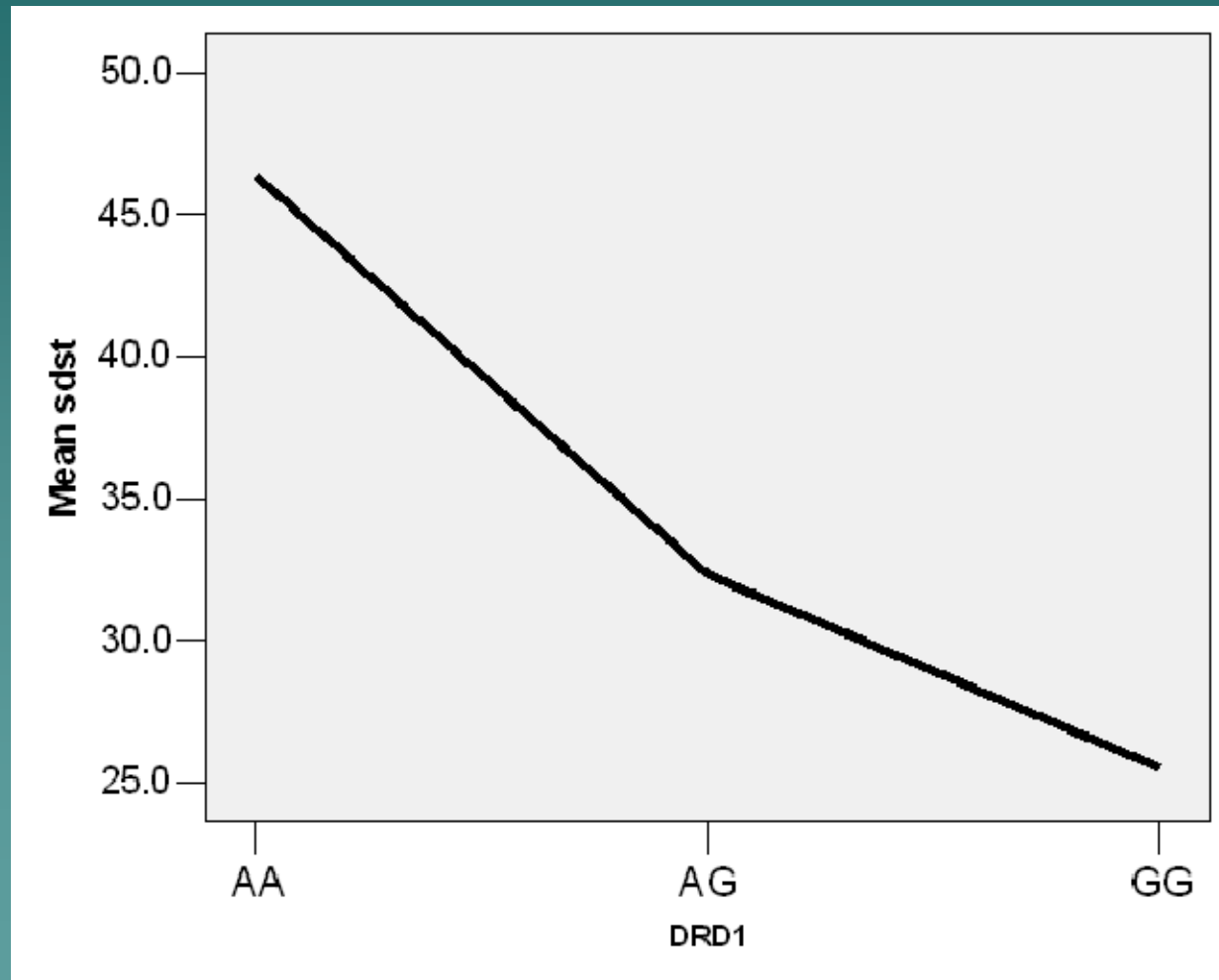
**-48 G allele over represented in the non responders**

**Hwang, R et al ASSOCIATION STUDY OF FOUR DOPAMINE D1 RECEPTOR GENE POLYMORPHISMS AND CLOZAPINE TREATMENT RESPONSE**

# Attentional/WM Performance by DRD1 Genotype

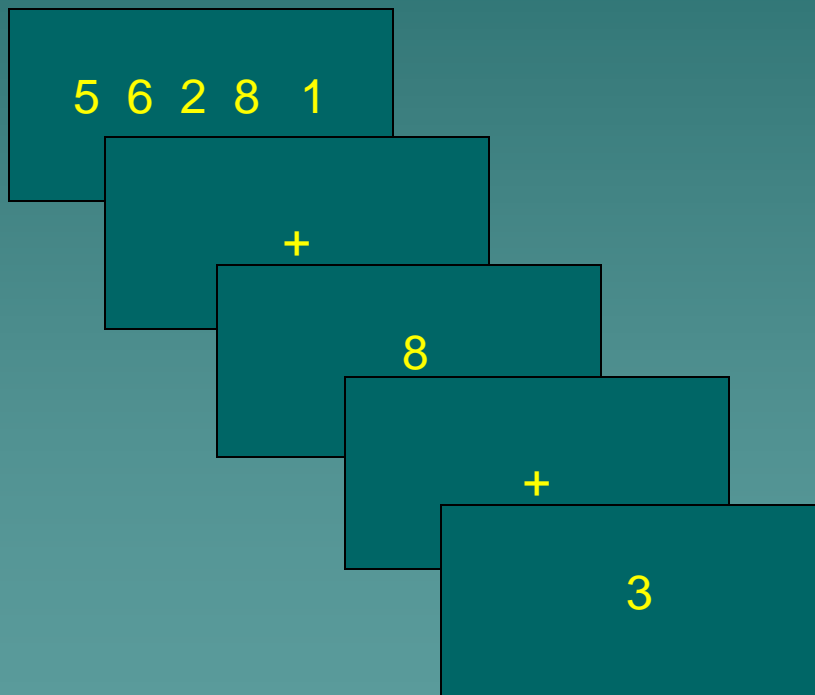
C-MINDS Battery

- Symbol Digit Substitution Test (total correct in 60 sec),  $p < .038$

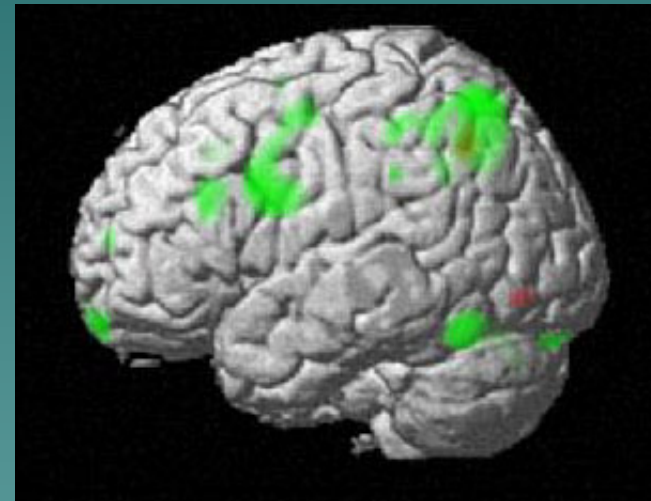


# Working Memory

## ◆ Sternberg task:

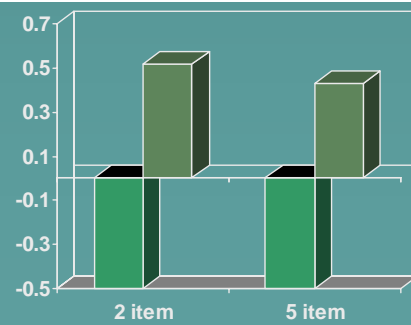
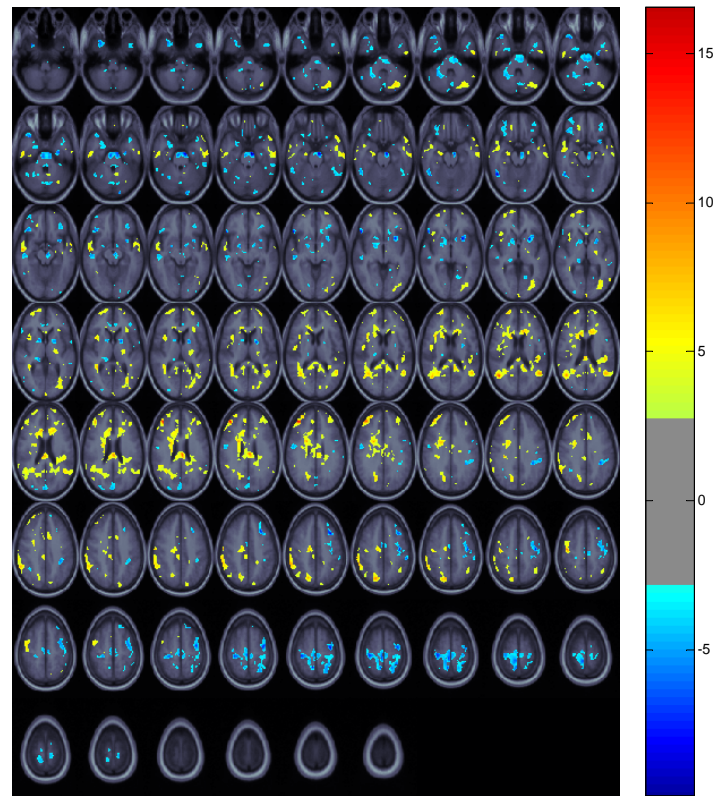


## ◆ Example Data

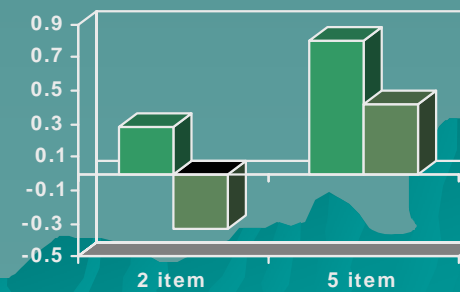
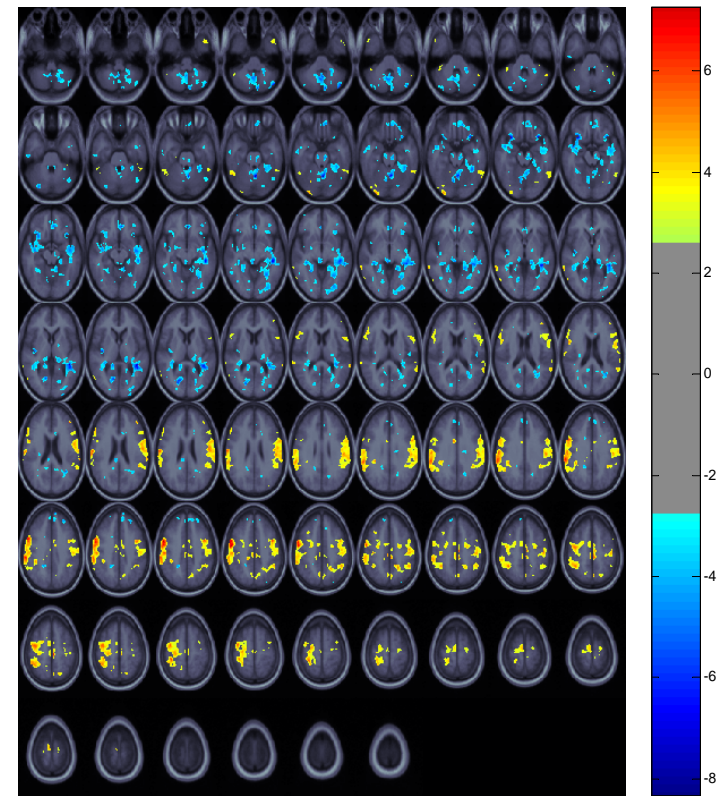




## D1 Group A A



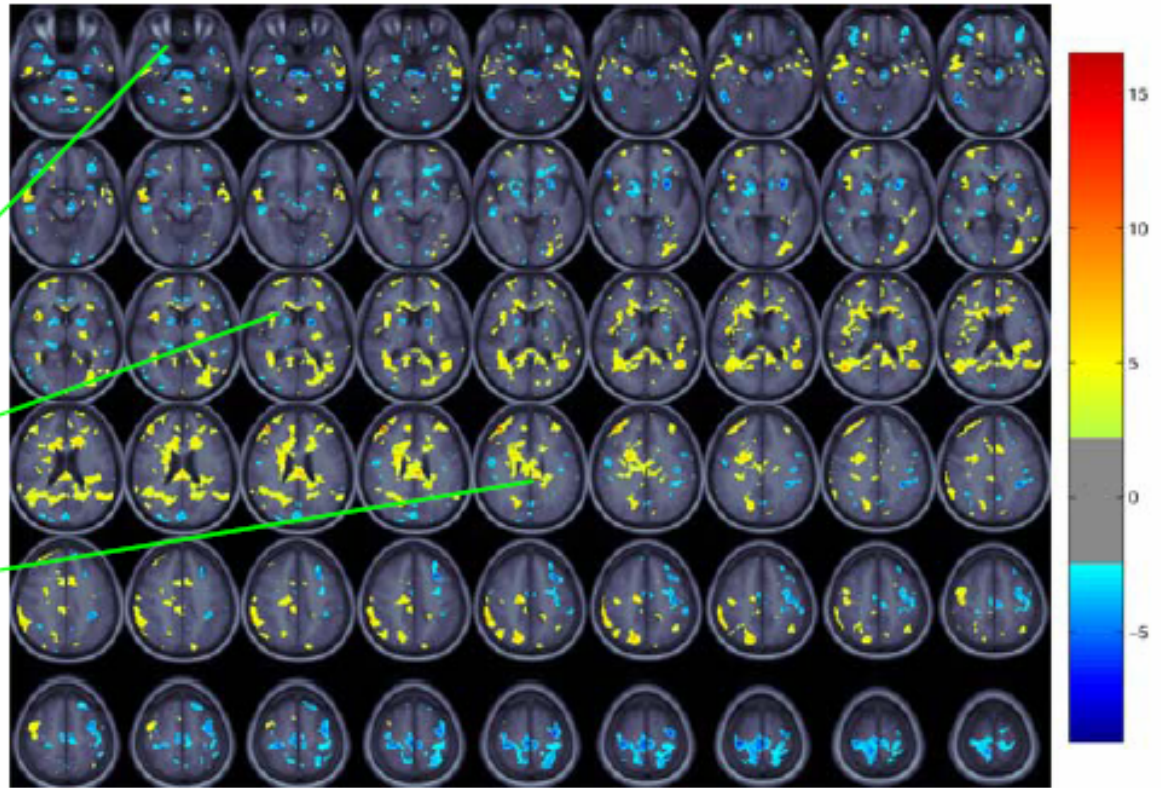
## D1 Group A G



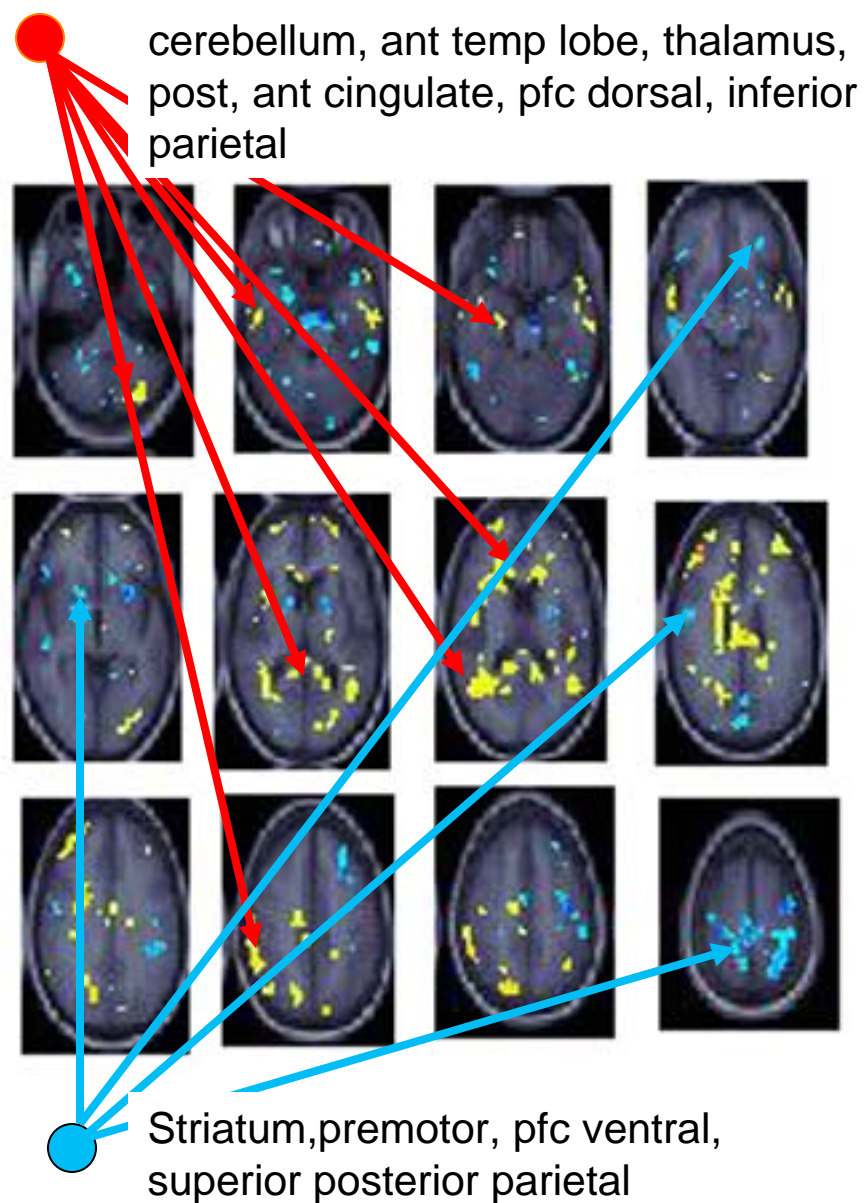
# Genotype and Circuitry

- ◆ Inverse relationship between emotion and cognition by genotype
- ◆ Method for revealing circuitry by genotype

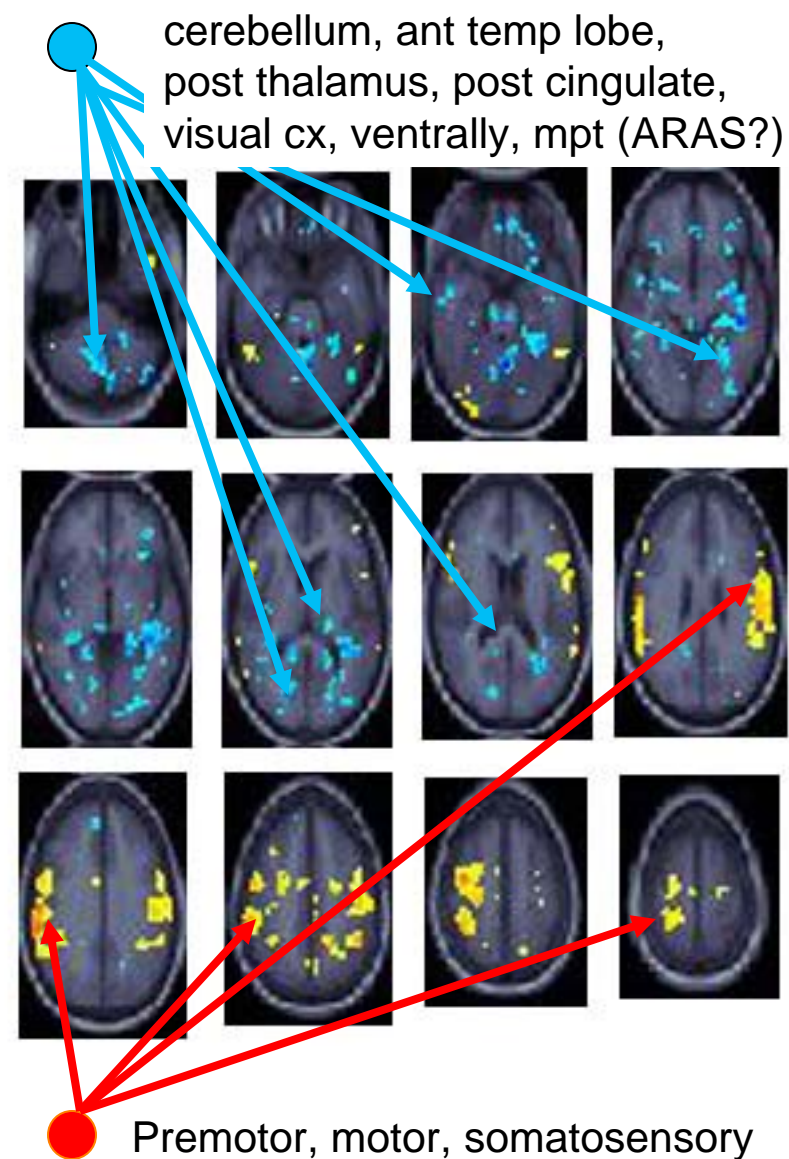
	Low Memory Load		High Memory Load	
	Accuracy	DLPFC	Accuracy	DLPFC
Amygdala				
G1	.62	-.71	.64	-.54
G2	.08	-.43	.17	-.09
Anterior Insular				
G1	-.60	.80	-.31	.55
G2	.11	.74	-.27	.53
Cingulate Cortex				
G1	-.76	.87	-.69	.62
G2	-.33	-.05	-.10	.44








Implied circuits: cerebellar/pontine/pfc,  
Ant+post attentional, language;  
Spatial, striatal



Implied circuits: Sensorimotor, premotor;  
Cerebellar, ventral visual, post attentional



# The limits of these approaches

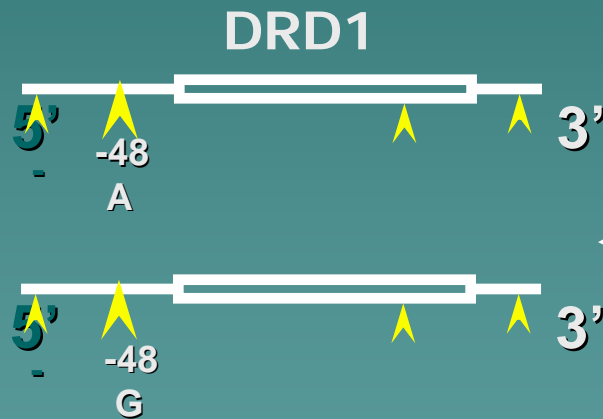
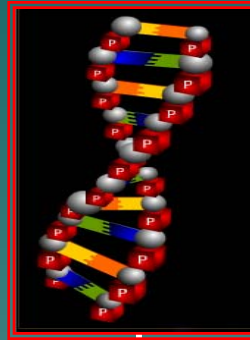
- ◆ Often, it's a single gene, single measure approach
  - ◆ Hypothesis-driven methods fail when faced with these datasets
    - Hundreds of thousands of SNPs
    - Thousands of measures
    - Hundreds of subjects
- 
- A stylized, dark teal silhouette of a mountain range is positioned in the bottom right corner of the slide, partially overlapping the background.

# Intermediate phenotypes

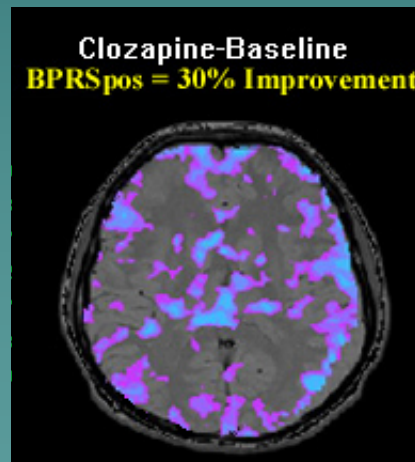
Combine neuroimaging  
With behavioral and  
clinical measures  
And genetics

To identify useable  
phenotypes

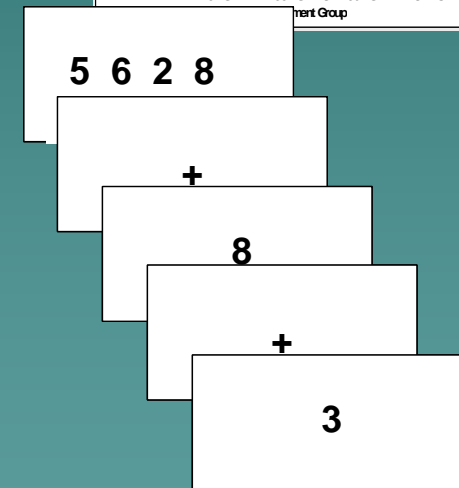
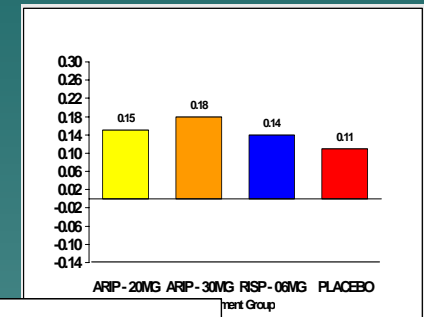
DNA



Inherited  
genotype

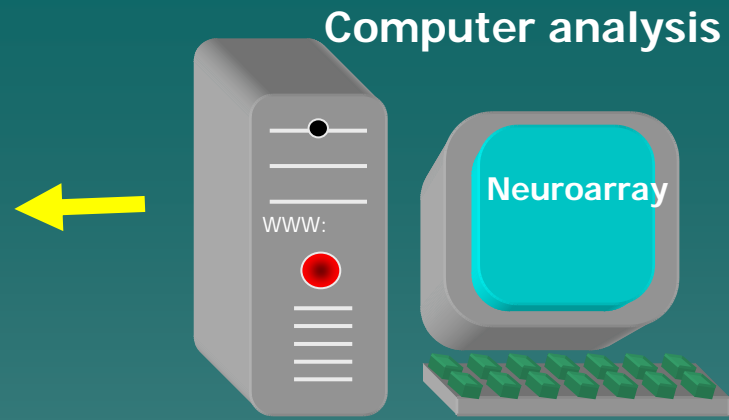


Neuroimaging



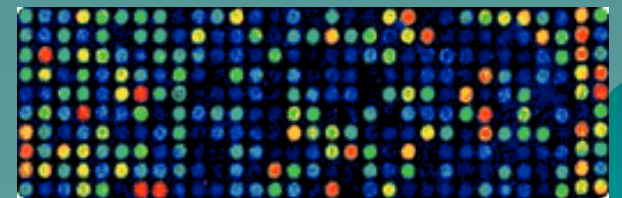
Clinical and cognitive  
measures

**Best treatment  
based on  
probabilities of medication  
response  
and development of side-  
effects**

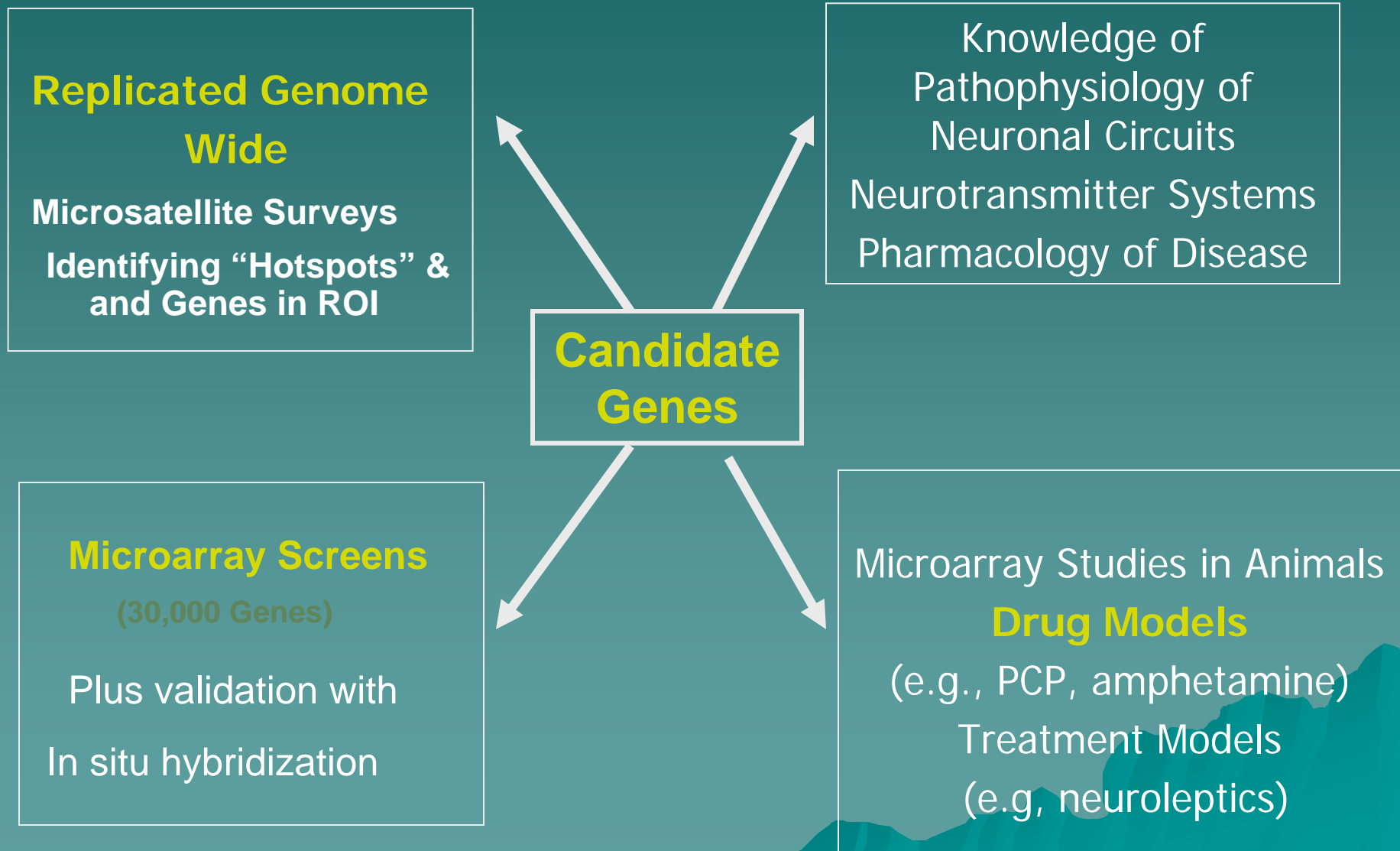


	Efficacy	Negative	Cognitive	DM	Weight	Suicide
Clozapine	90	80	25	50	85	2
Asenapine	90	80	50	10	15	?
Olanzapine	80	70	20	70	90	4
Ziprasidone	85	75	30	20	10	?

**Analyze Image**



# Strategies for Discovering Novel Candidate Genes & Drug Targets in Schizophrenia



# Key principles

- ◆ Choosing the right people
  - Expertise
  - Openness to teaching, sharing, and collaborating
  - Risk-takers
- ◆ Cultural differences by disciplines
  - Creativity
  - Presentations not journals

# Transdisciplinary Imaging Genetics Center

## Key Investigators

William Bunney – Conte Center Director, Psychiatry

James Fallon – Neuroanatomy and Neurobiology

Yi Jin – Electrophysiology

David Keator – Bioinformatics

James Kennedy – Psychiatric genetics

Falko Keuster – Virtual reality and visualization

Fabio Macciardi – Genetics, Epidemiology, Statistics

Steven Potkin – TIGC PI, Brain imaging, psychiatry

Jessica Turner – fMRI and Cognitive Sciences

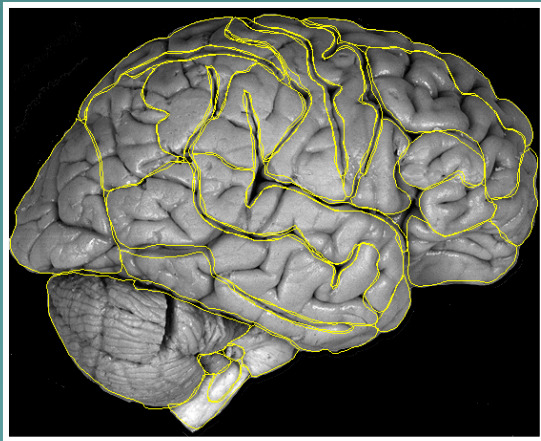
Padhraic Smyth – Computer Sciences, Datamining

Hal Stern – Statistics

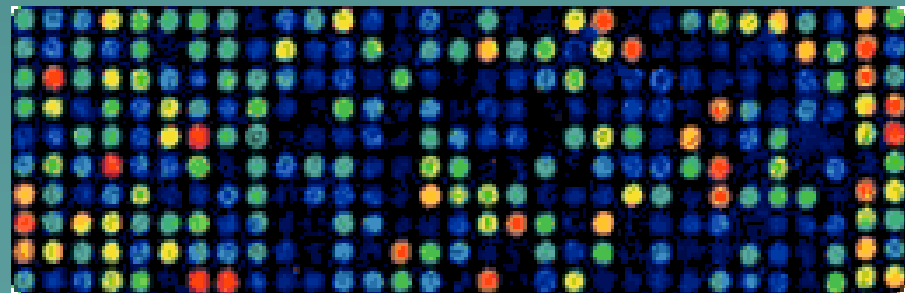
TIGC

# Transdisciplinary Imaging Genetics Center Key Investigators

**William Bunney – Conte Center Director,  
Psychiatry**



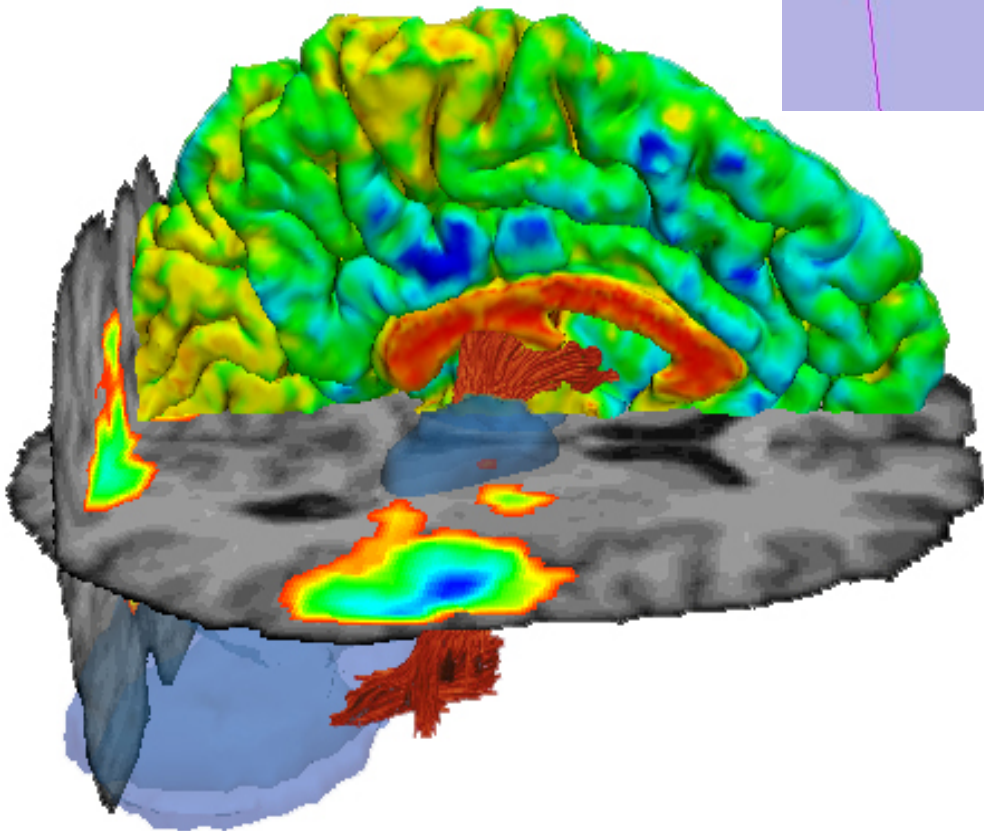
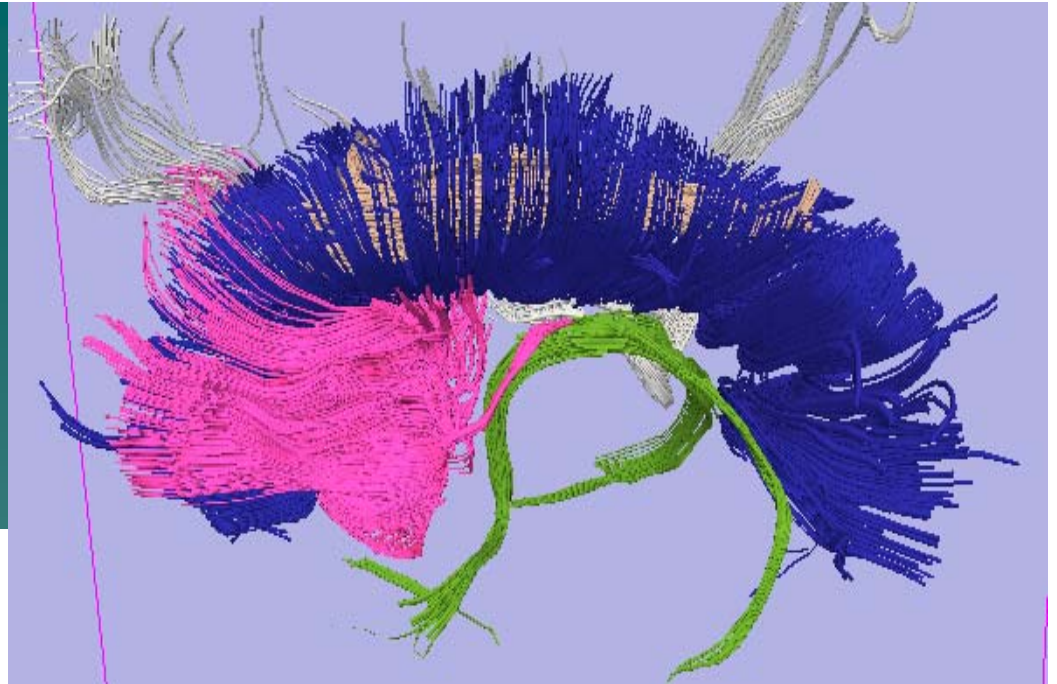
Microarray  
Research



TIGC



# Jim Fallon Neuroanatomy



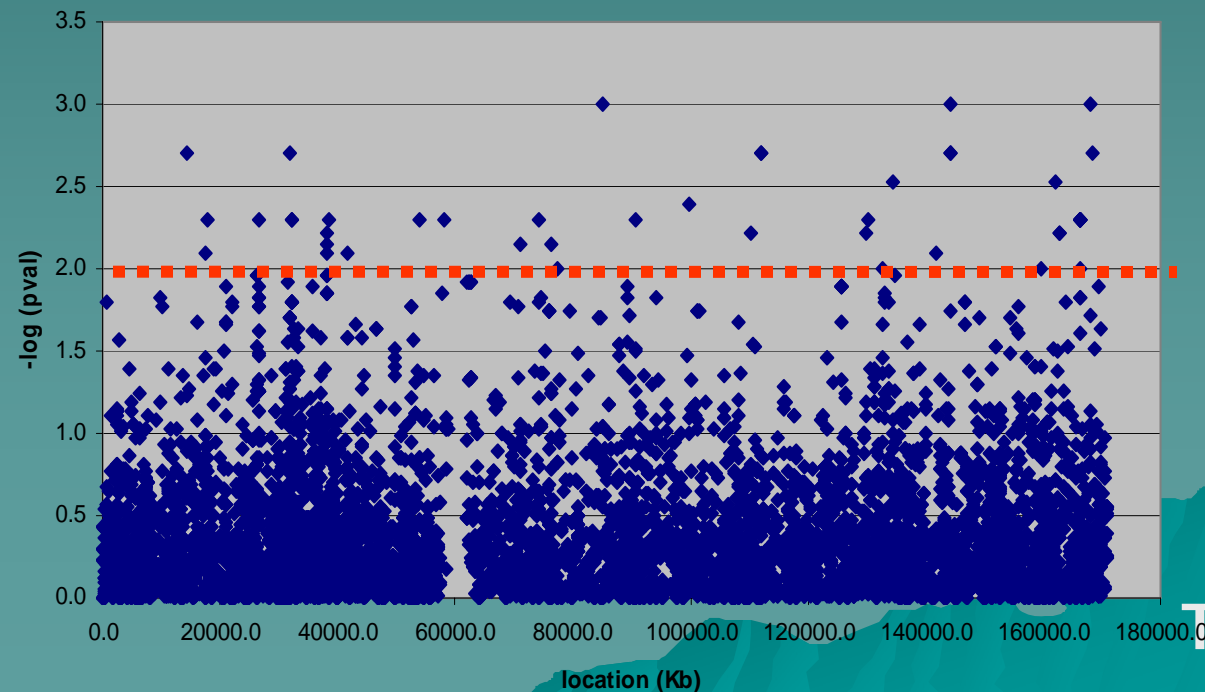


# Transdisciplinary Imaging Genetics Center Key Investigators

James Kennedy – Psychiatric genetics

Fabio Macciardi – Genetics,  
Epidemiology, Statistics

pval distr of 6600 SNPs on chr 6



TIGC

# **Transdisciplinary Imaging Genetics Center Key Investigators**

**David Keator – Bioinformatics**

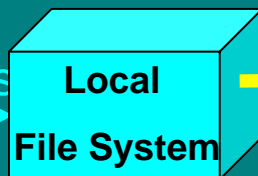
A stylized, dark teal mountain range graphic is positioned in the bottom right corner of the slide, partially overlapping the TIGC text.

**TIGC**



fMRI Scanner

FMRI Images



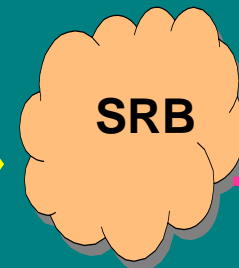
Local  
File System

SRB SM = Local SM

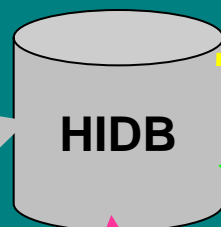
SRB BH = Local BH

SRB AO = Local AO

SRB SIRP = Local SIRP



SRB



HIDB



- Clinical Data

- Computer Aided Scale Input (CALM/GAME)
- Clinical Data Entry Interface

Which Project?  
Which Subject?  
Which Visit?



Run Upload Script

URL Link

# Transdisciplinary Imaging Genetics Center Key Investigators

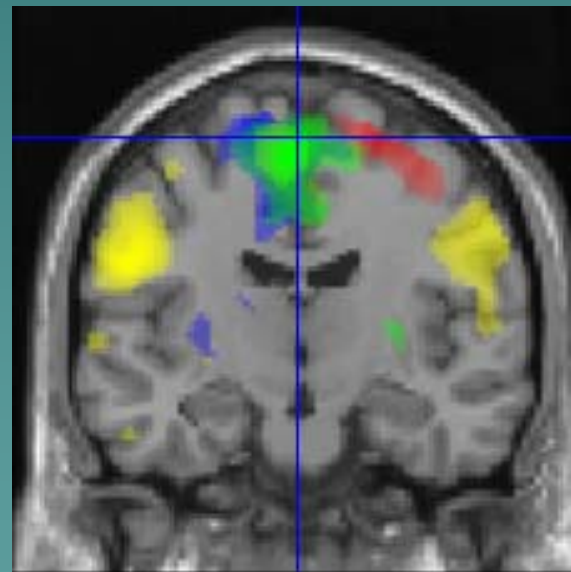
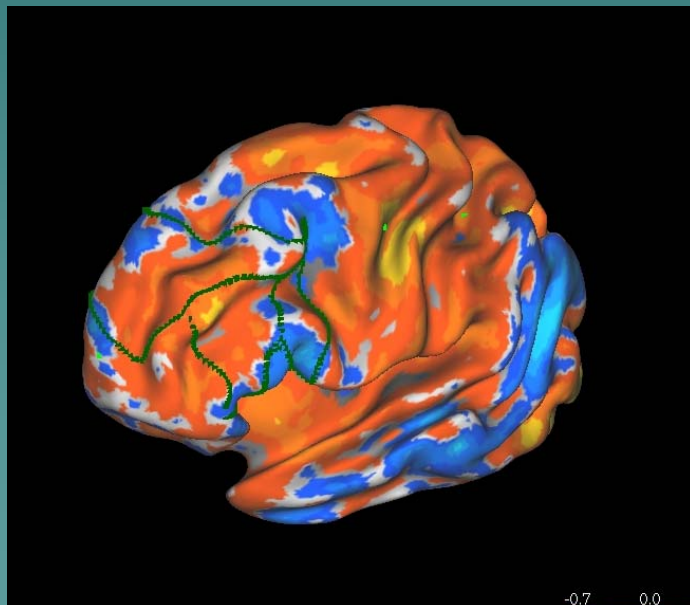
## Falko Kuester – Virtual reality and visualization



TIGC

# Transdisciplinary Imaging Genetics Center Key Investigators

## Jessica Turner – fMRI and Cognitive Sciences

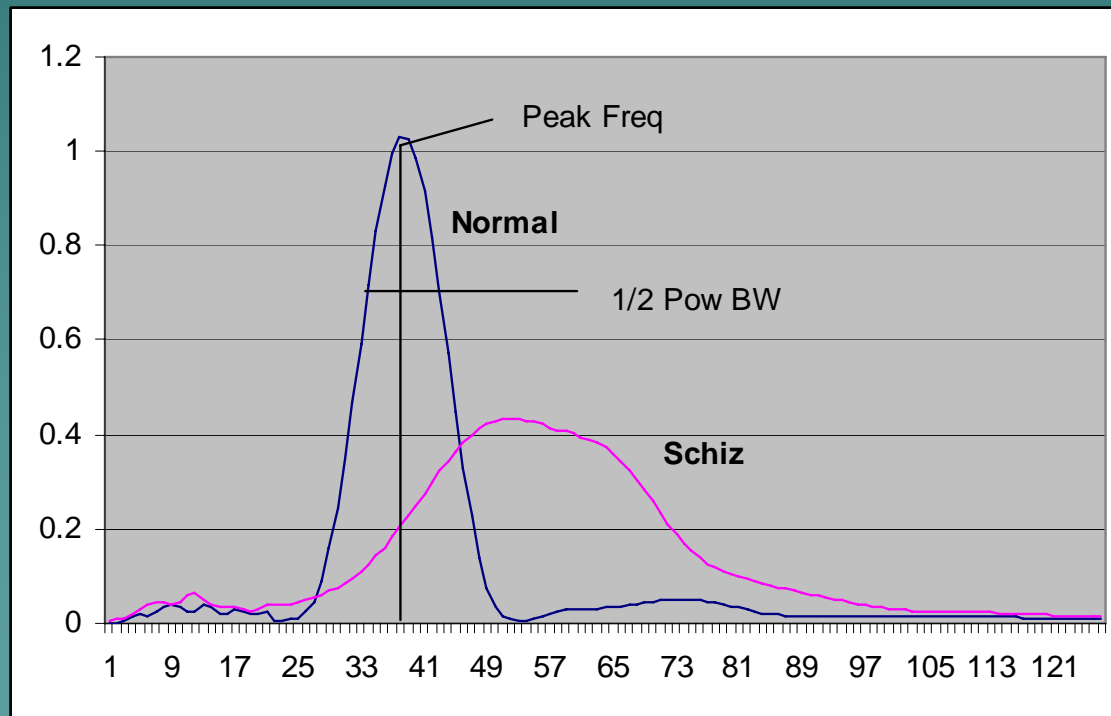


- Left Wrist
- Right Foot
- Tongue
- Left Foot

TIGC

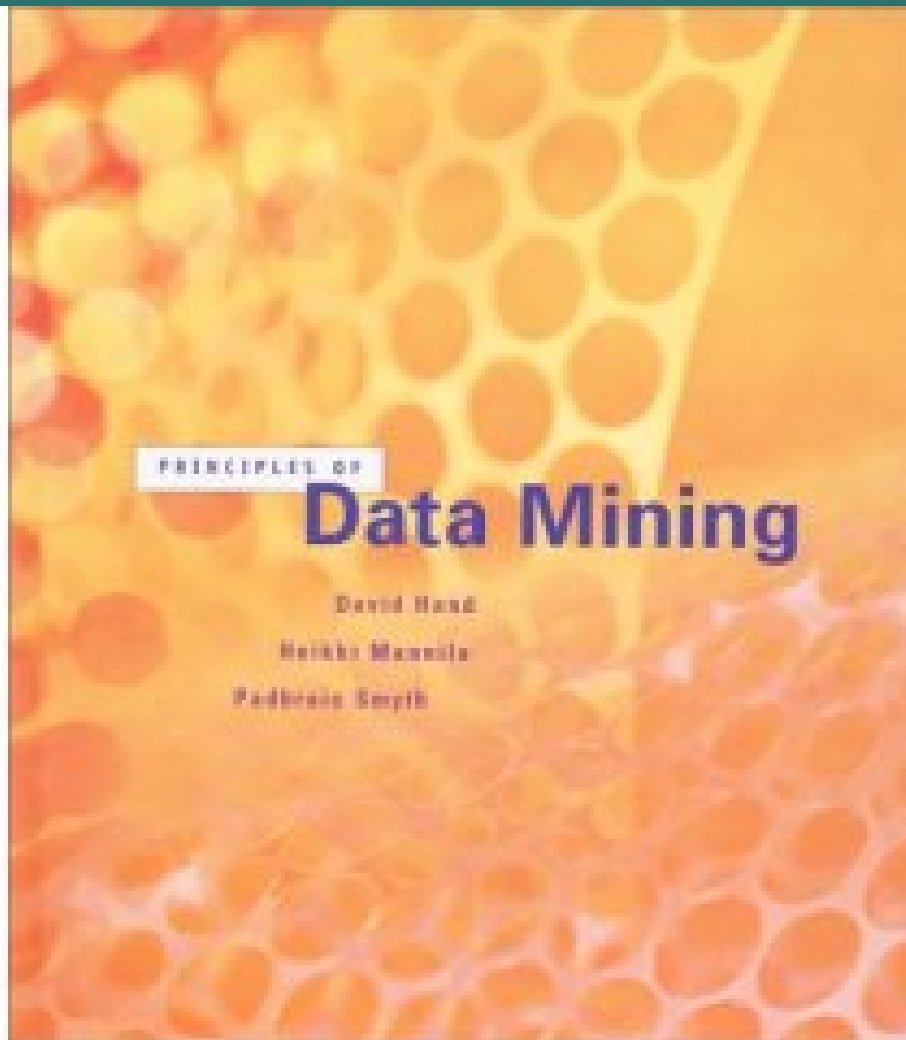
# Transdisciplinary Imaging Genetics Center Key Investigators

## Yi Jin – Electrophysiology



# Transdisciplinary Imaging Genetics Center Key Investigators

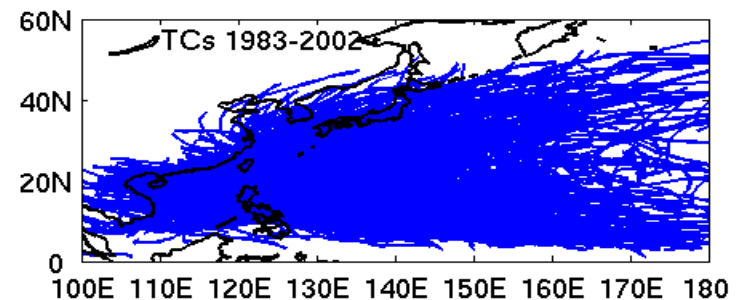
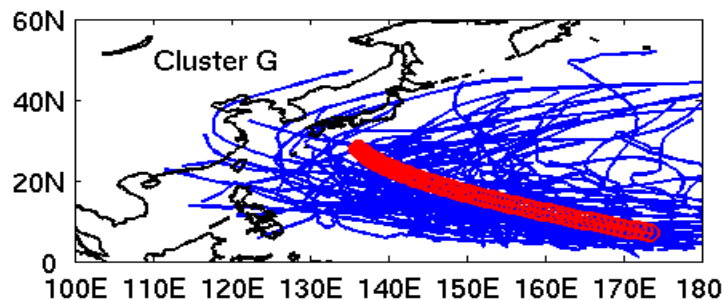
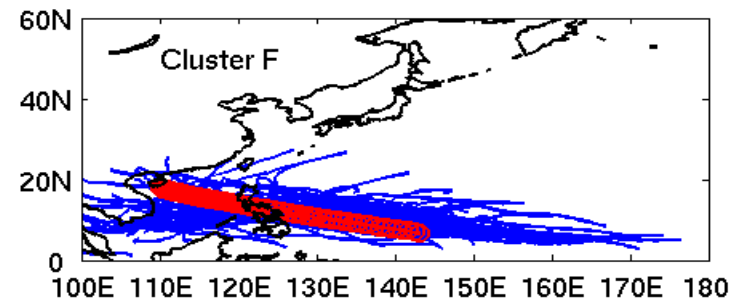
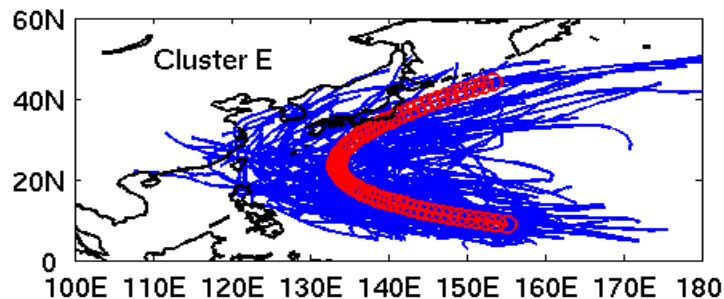
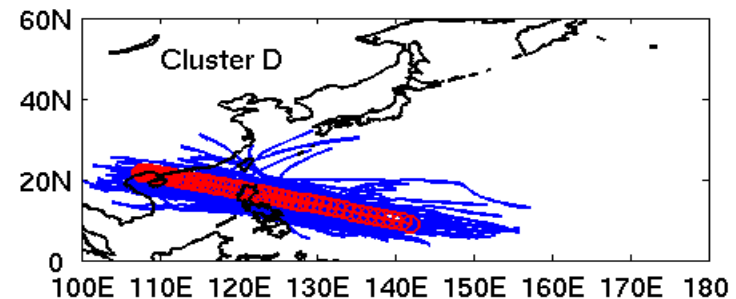
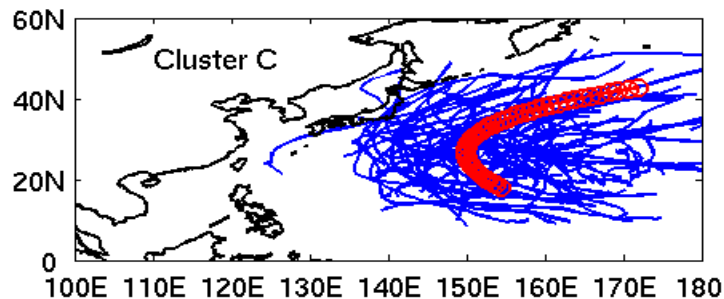
Padhraic Smyth – Computer Sciences, Datamining



TIGC

# Transdisciplinary Imaging Genetics Center Key Investigators

Padhraic Smyth – Computer Sciences, Datamining



TROPICAL CYCLONES Western North Pacific 1983-2002



# Transdisciplinary Imaging Genetics Center

## Post-doctoral researchers and students

### Imaging and genetics

Martina Panzenboeck, M.D.—imaging analyses of DTI

David Medina Fuentes, M.D.—imaging and genetics analyses

Sergey Kirshner, Ph.D.—mixture models of imaging genetic data

Seyoung Kim (Ph.D. candidate)—cluster analyses of imaging data

### Genetics

Rudi Hwang, M.D.—gene-gene interactions

Clement Zai, Ph.D.—genetic polymorphisms

### Visualizations

Vid Petrov (Ph.D. candidate)—visualization of imaging data

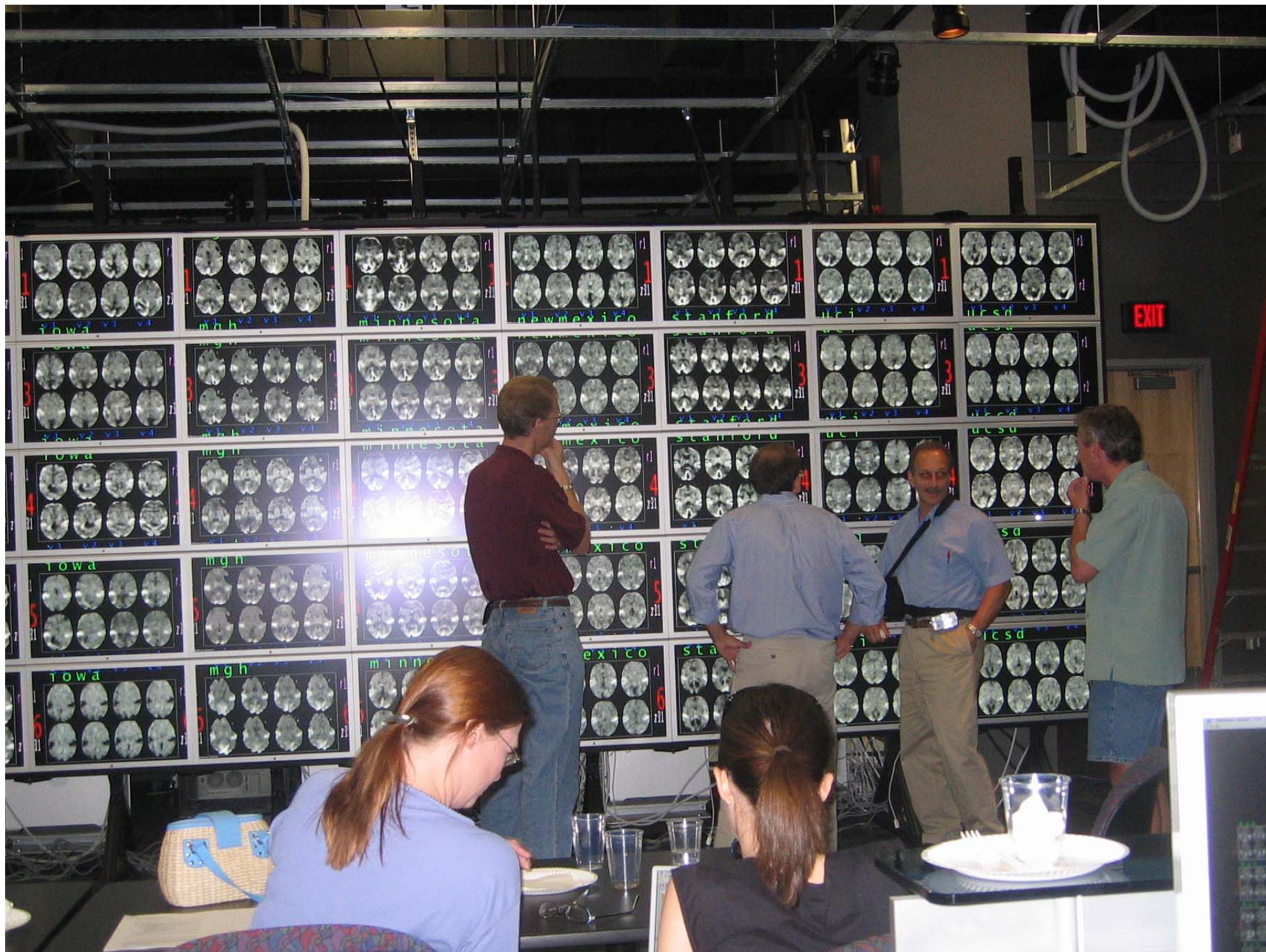
Zhiyu He (Ph.D. candidate)—visualization of cluster data

# Establish a common language


- ◆ Didactic seminars
- ◆ Weekly meetings for senior investigators







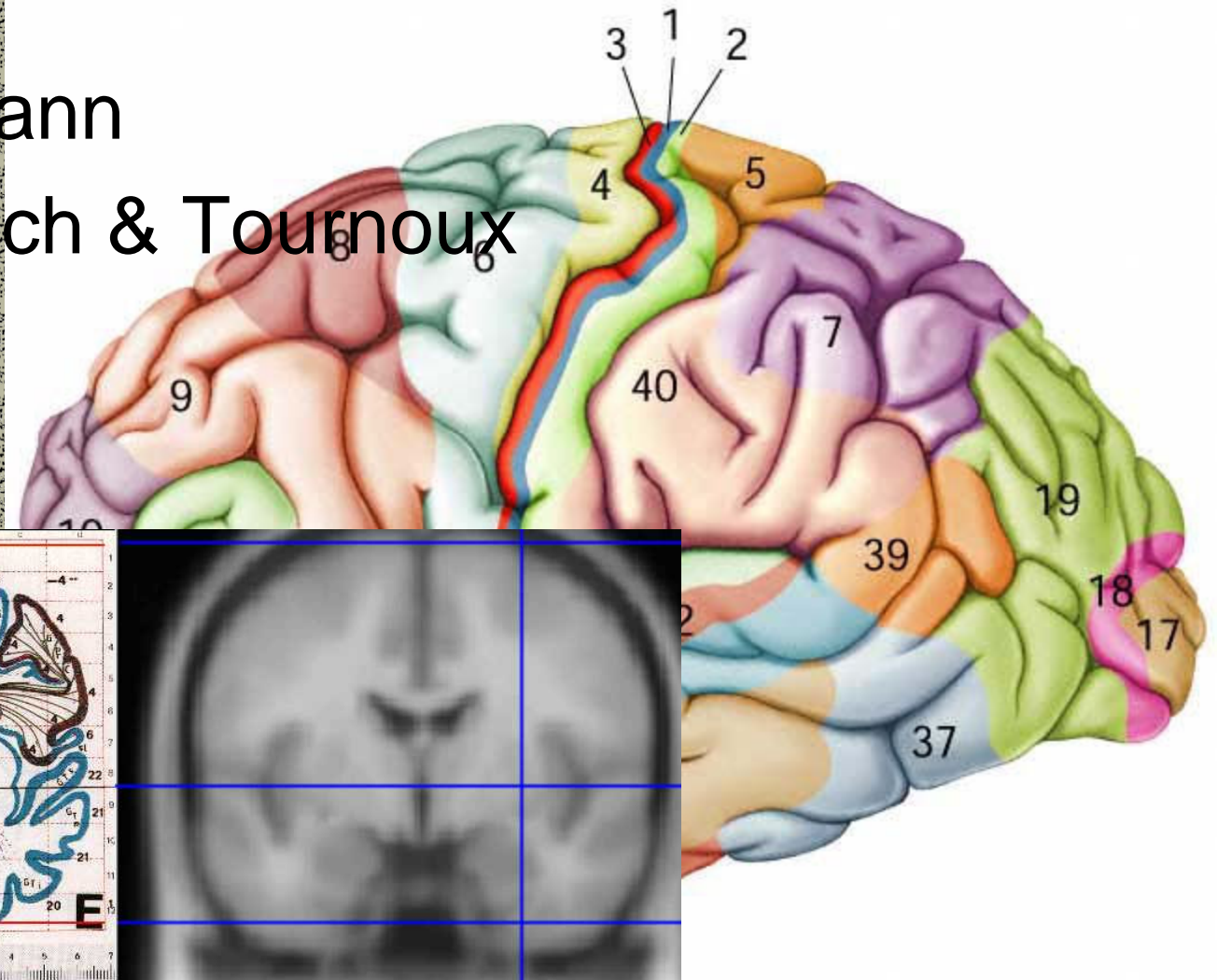
# Communication

- ◆ **Introductory lectures across fields**
  - ◆ MRI
  - ◆ PET
  - ◆ Neuroanatomy
  - ◆ Clustering
  - ◆ Hierarchical models
  - ◆ Genetics
- 
- A stylized, dark teal silhouette of a mountain range is positioned in the bottom right corner of the slide, extending from the right edge towards the center.



# Atlases and Nomenclature

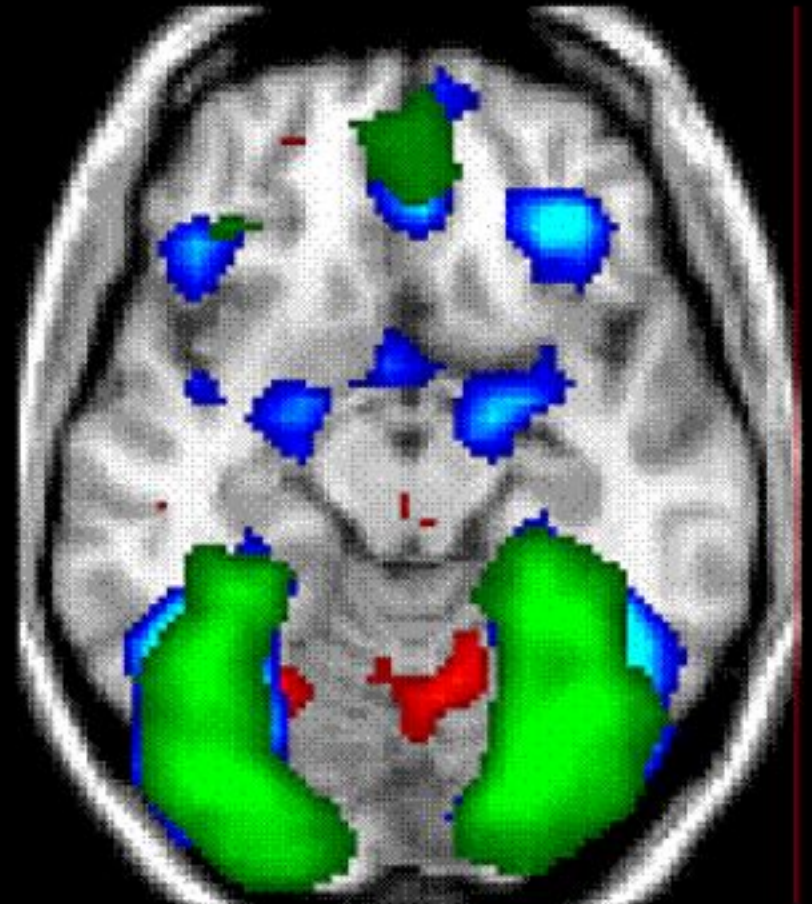
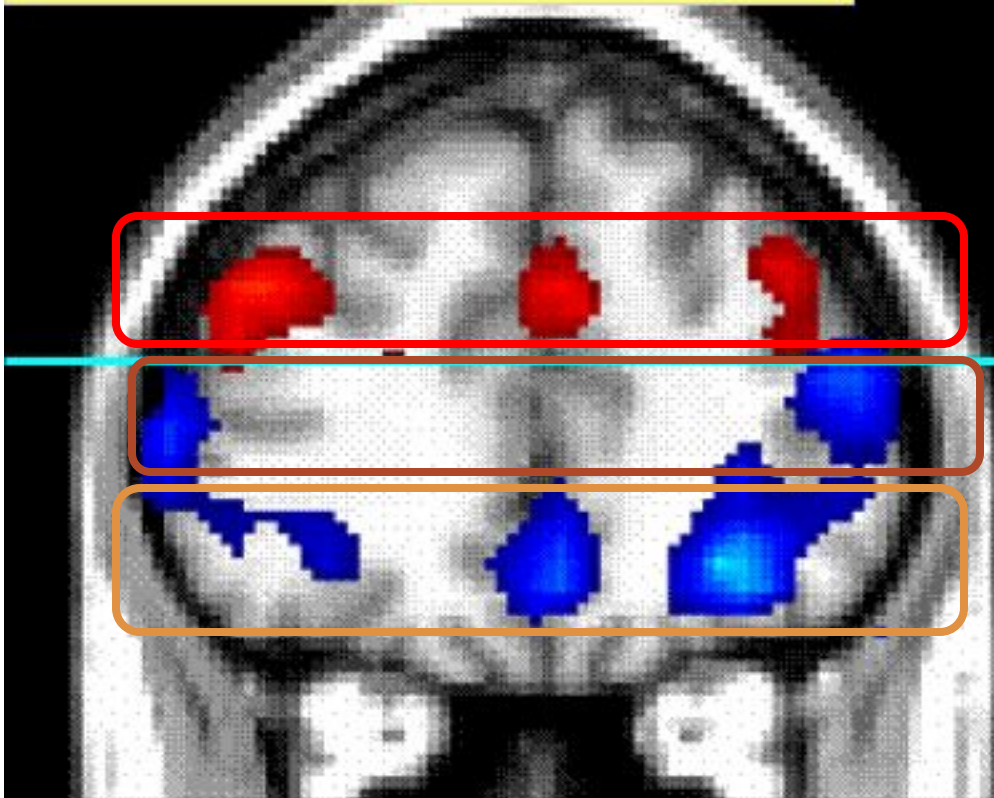
- Brodmann
- Talairach & Tournoux
- MNI
- Others





# Dorsal vs ventral stream activation- fMRI

Attended cognitive targets

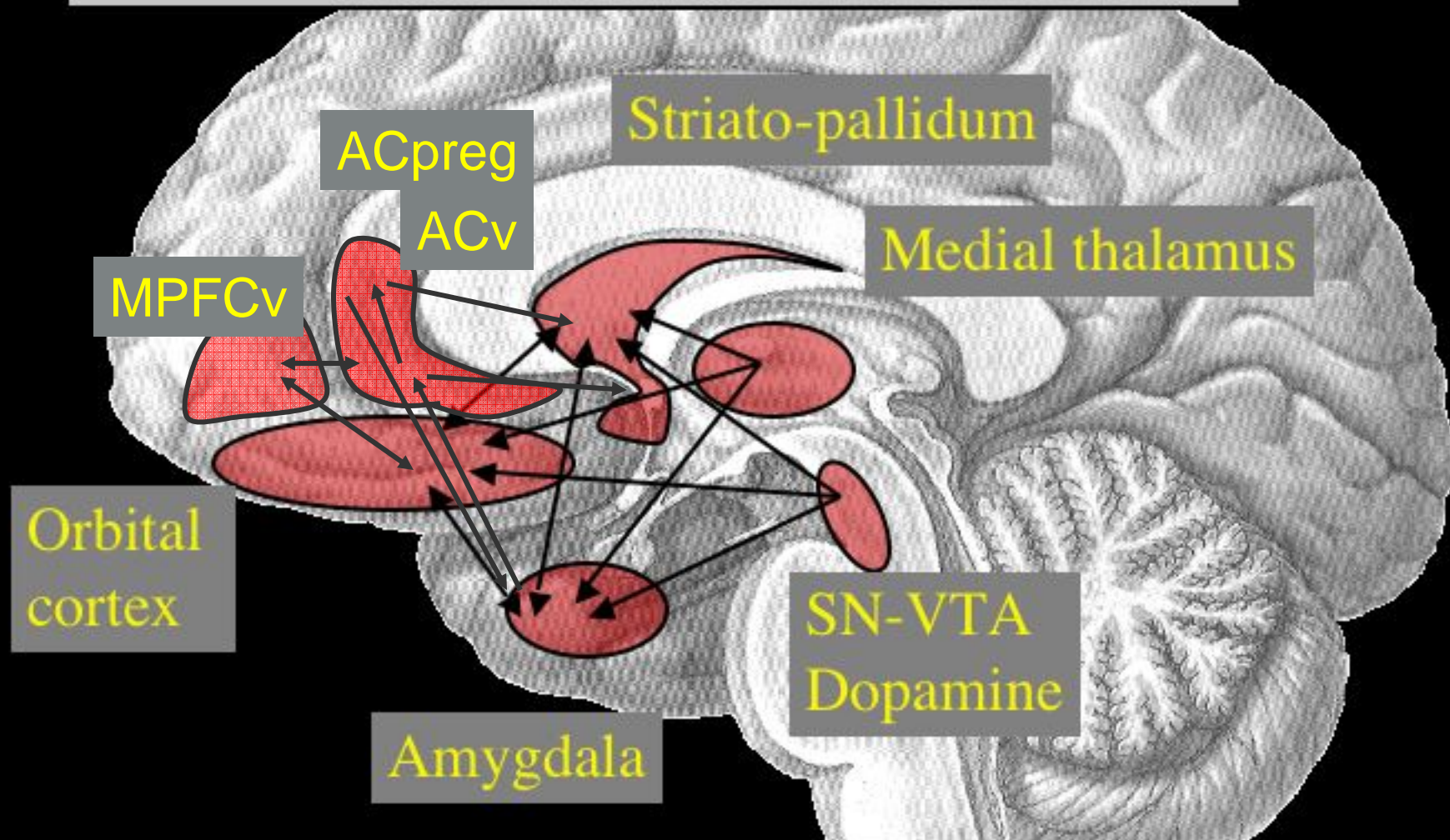


Emotional distractors response

Neutral distractors response

Greg McCarthy, 2004

# The “Ventral Prefrontal System”

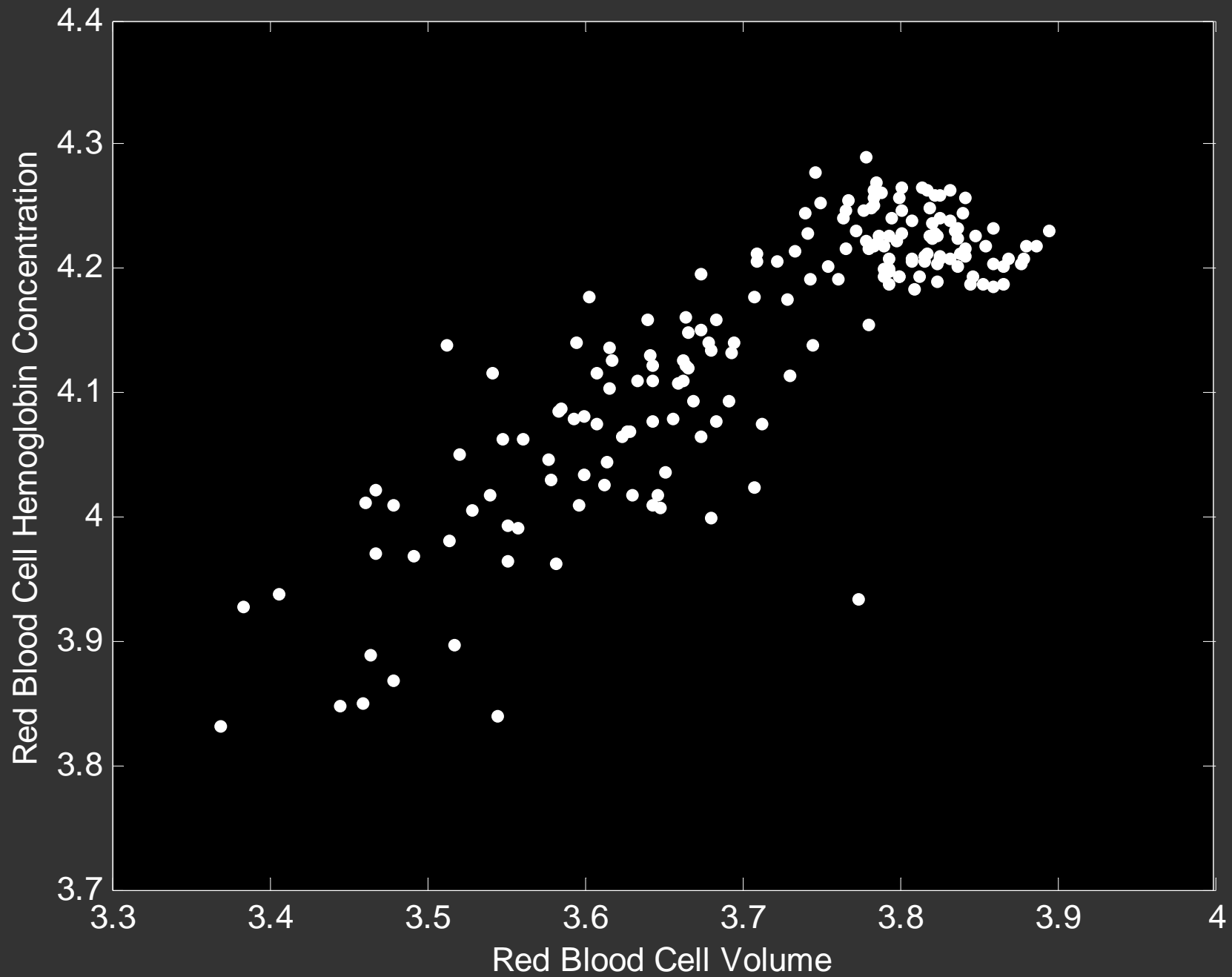


DA in the mesolimbic, mesocortical, and mesostriatal components of the “Prefrontal System”-control system for integration of emotion, motivation, will, action, and thought

Fallon

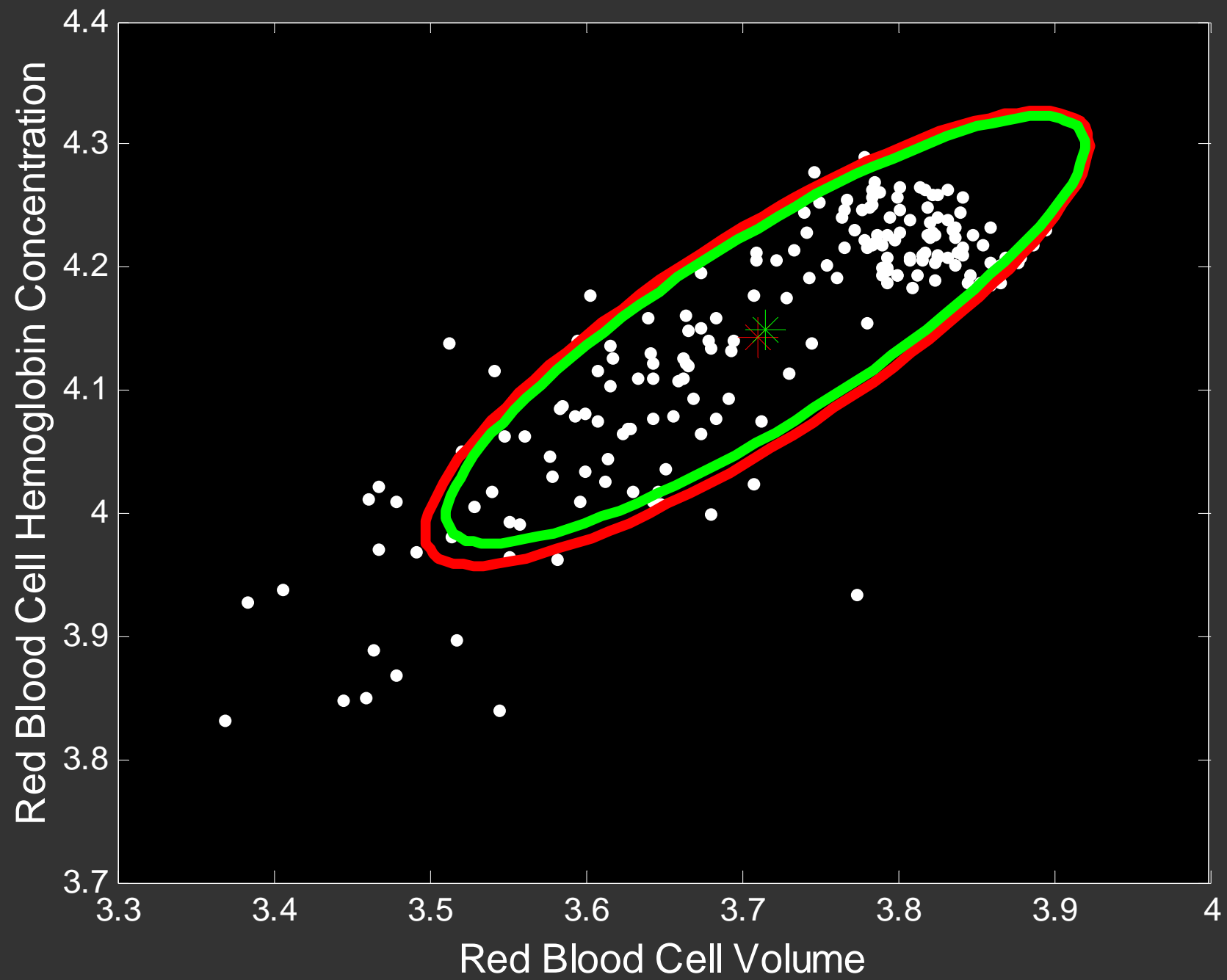


# ANEMIA PATIENTS AND CONTROLS

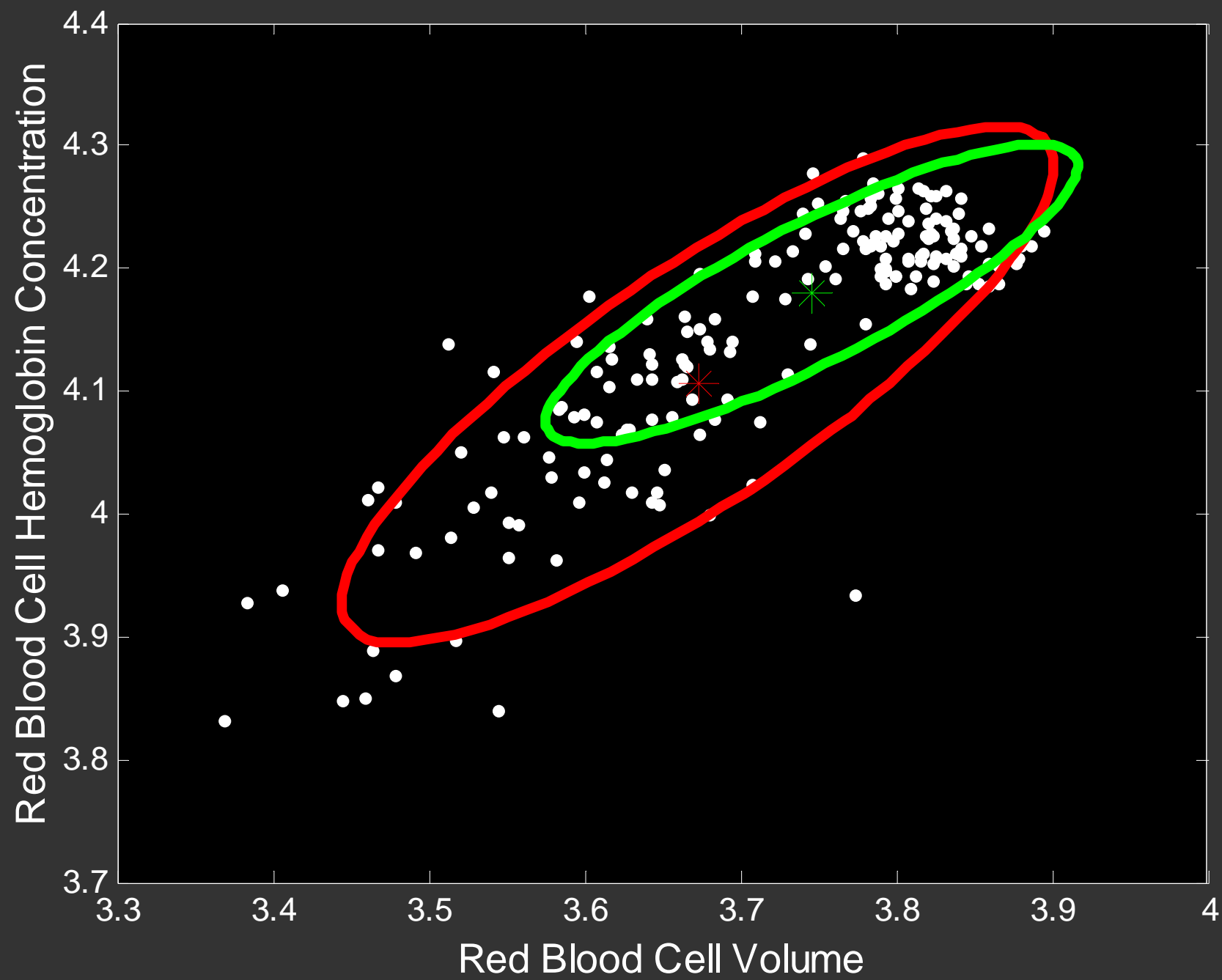




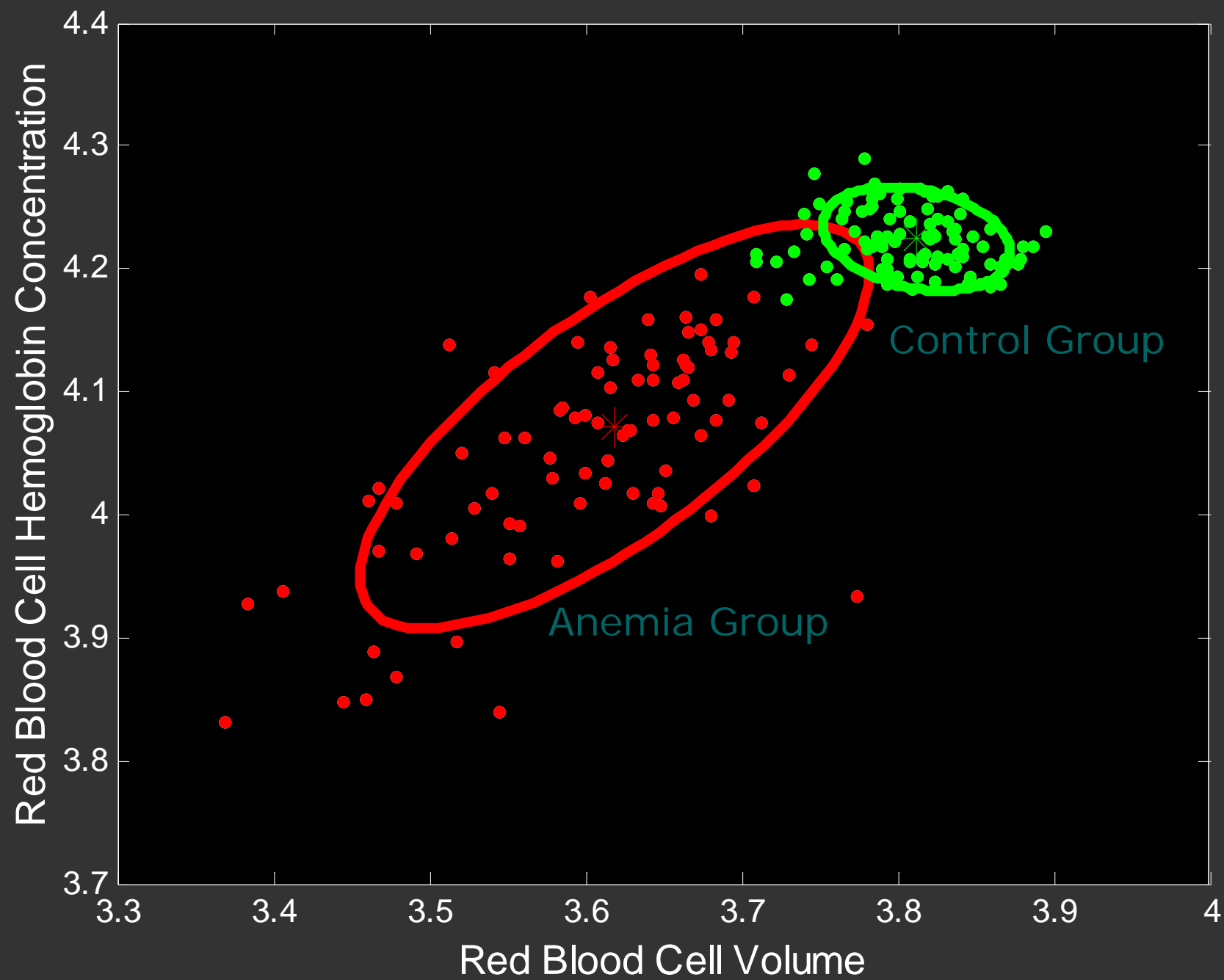
## EM ITERATION 1



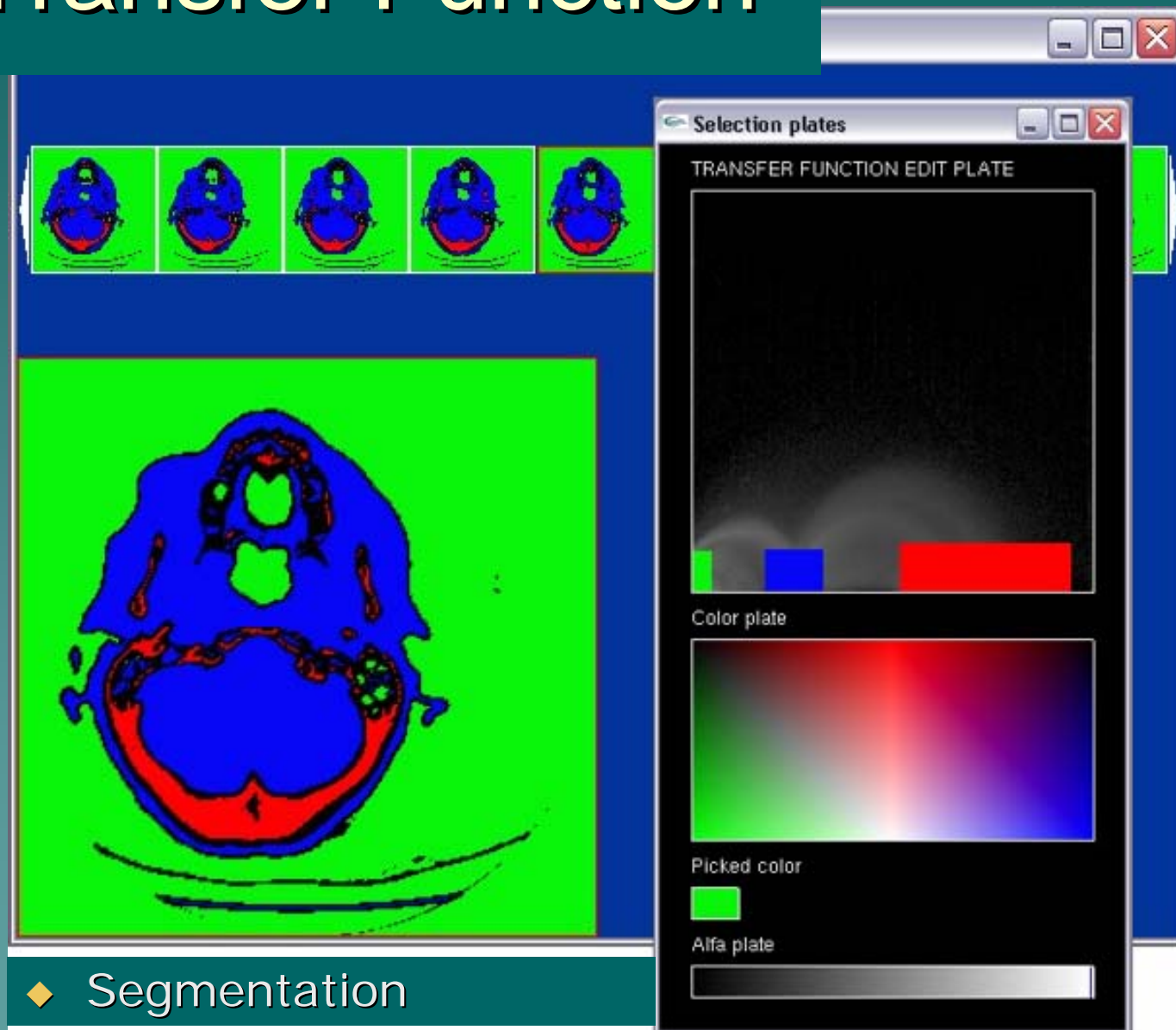
EM ITERATION 5



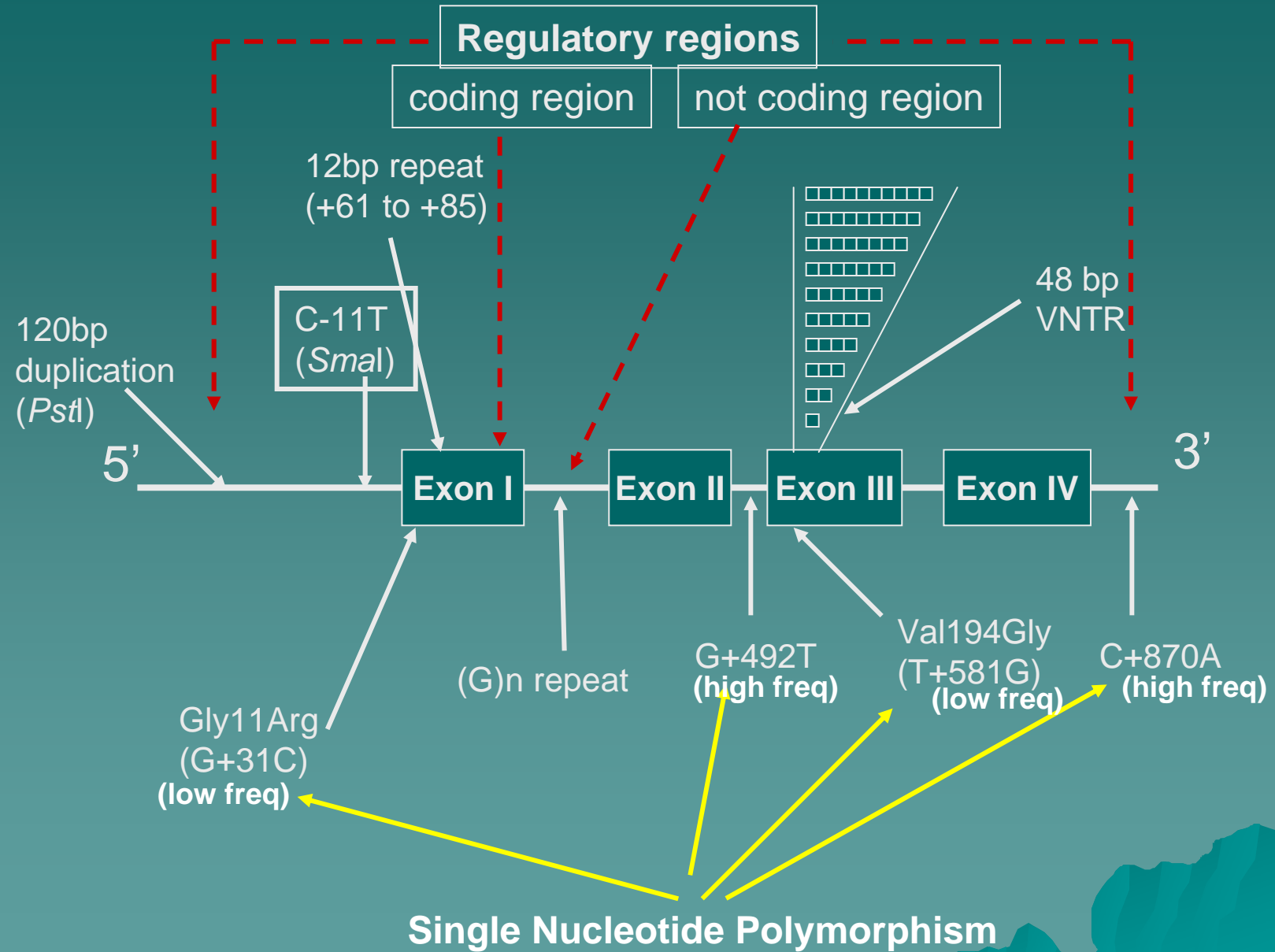
# ANEMIA DATA WITH LABELS



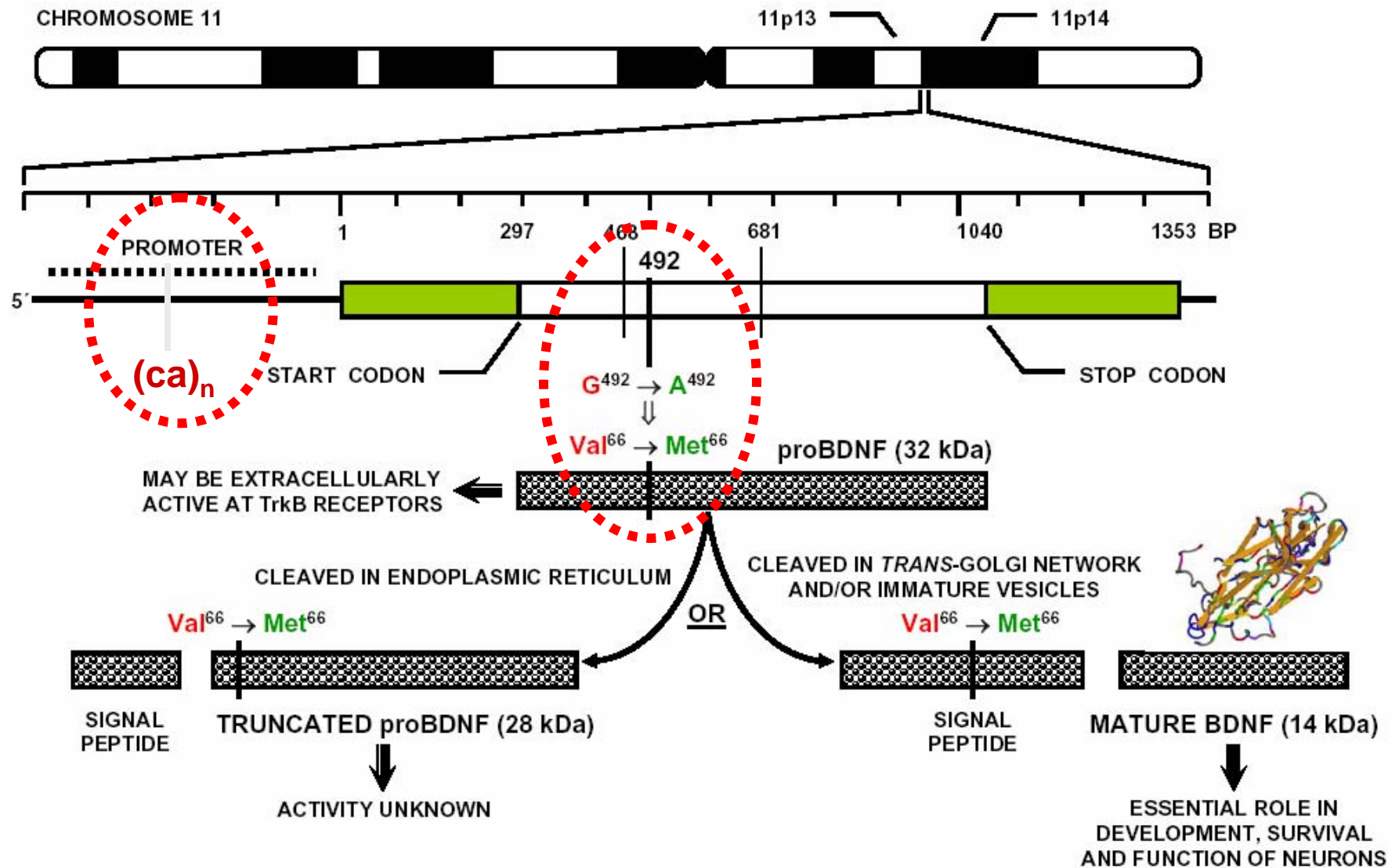
# 2D Transfer Function



# Blueprint of a 'gene'



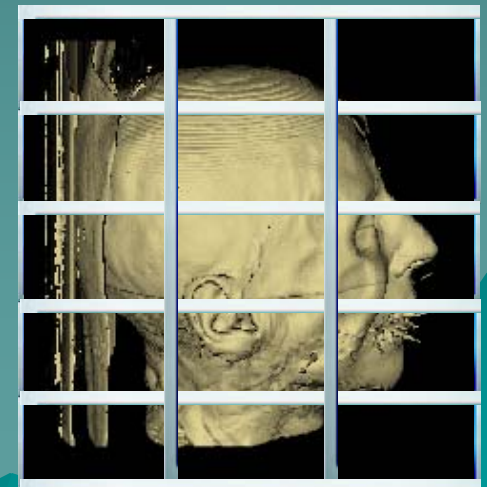
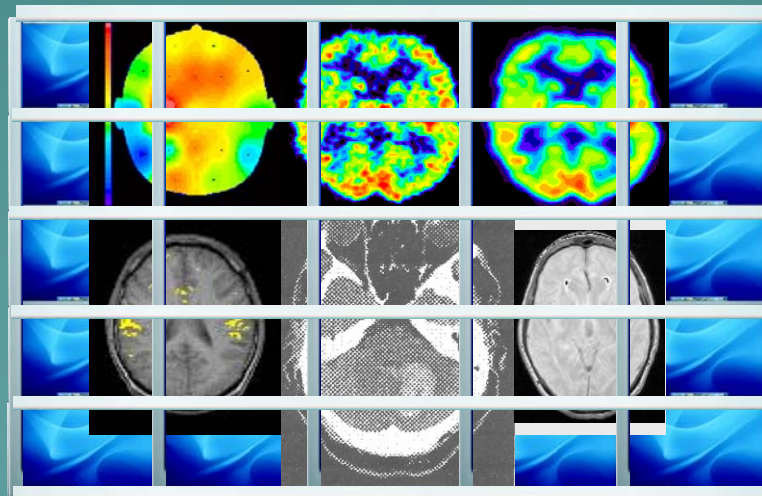
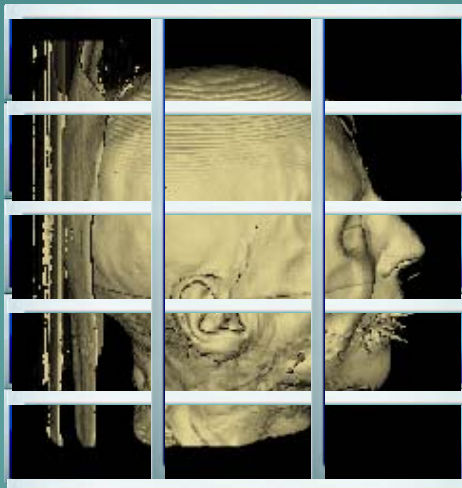
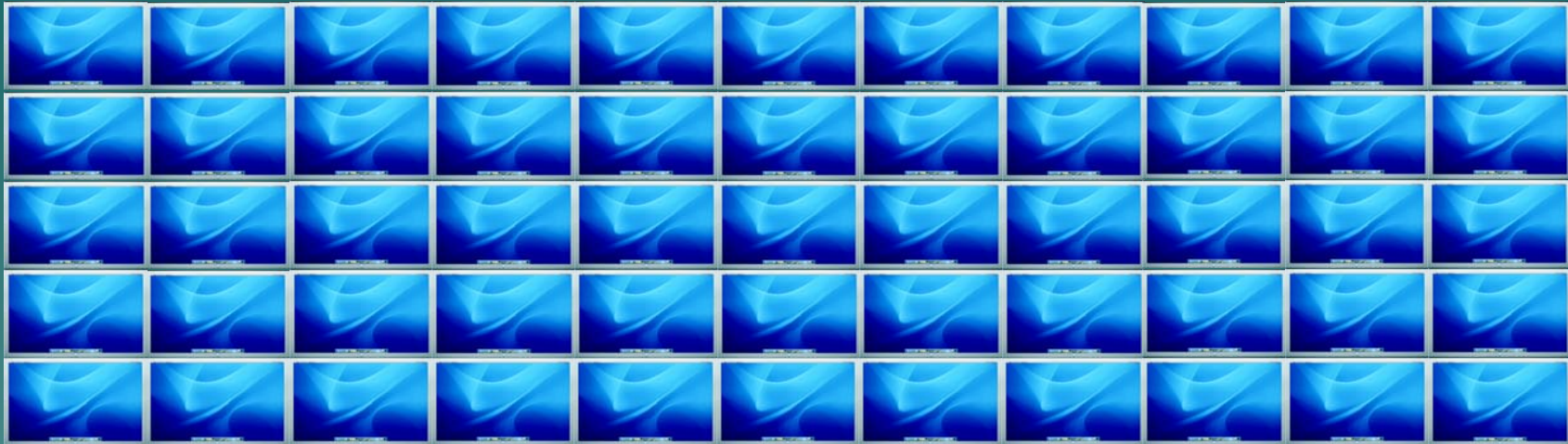
# The BDNF Gene



SOURCES: NCBI, ACCESSION # X60201; SHINTANI, ET AL. 1992; MURER, ET AL. 2001; MOWLA, ET AL. 2001



# TIGC & HIPerWall



# Developments

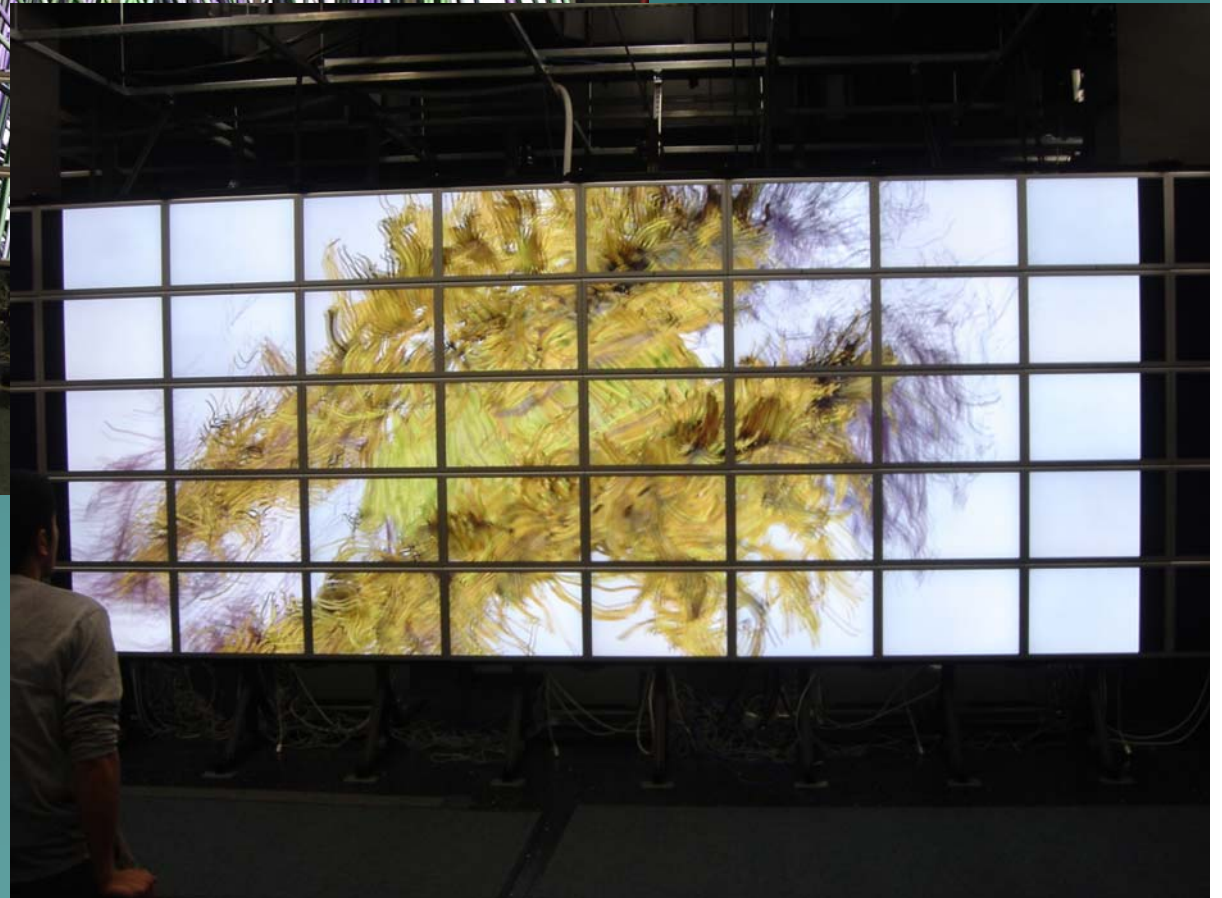
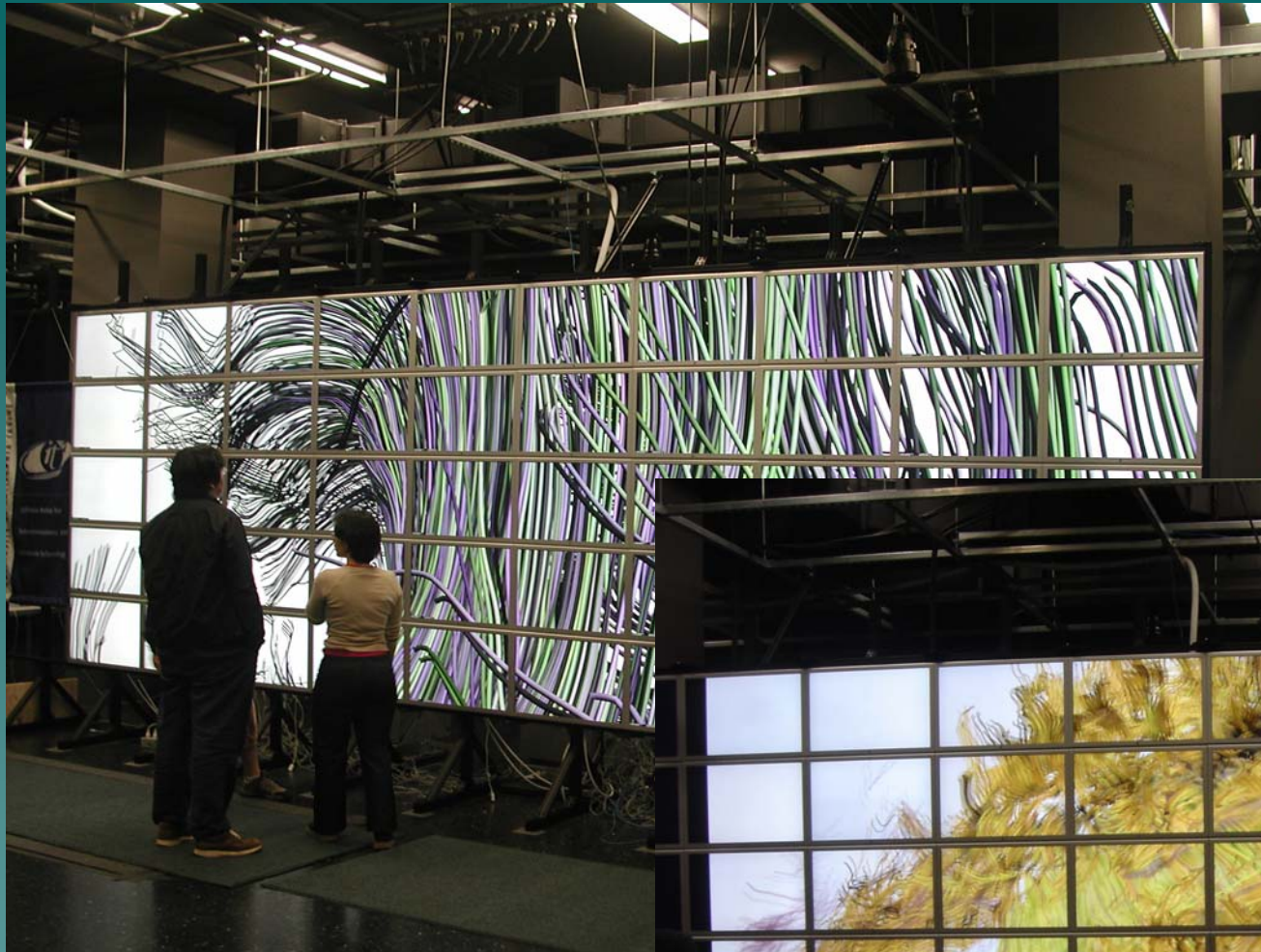
## ◆ Visualization: HiPerWall











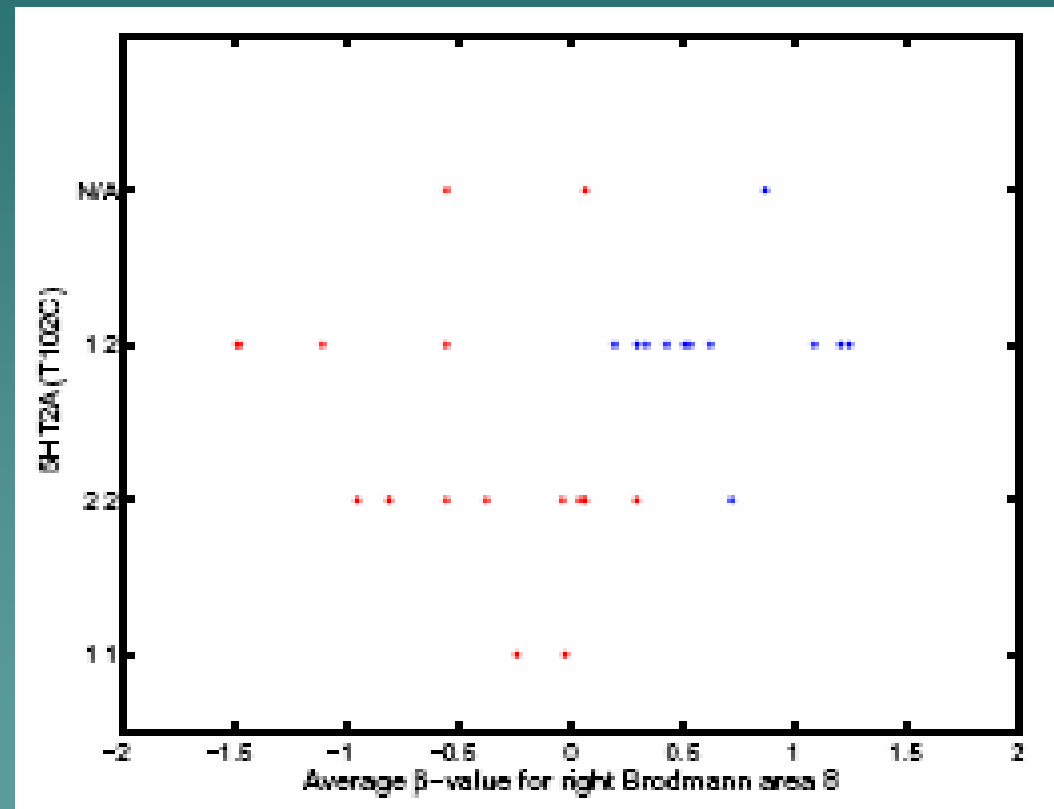
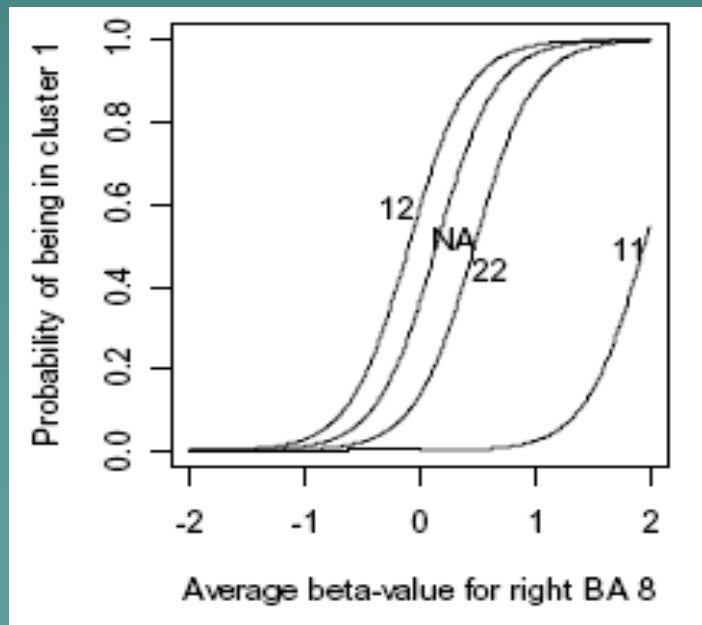
31433 ▼ *fx* rs6906175

[illegible]

# Exploratory Data Analysis: Mixture models

**Top:** Clustering of 28 schizophrenics into 2 groups based on a single SNP and single ROI activation

**Bottom:** Probability of being in cluster 1 (blue) based on genotype and activation





# Preliminary Results: Text Mining

- ◆ Extracted 60,000 abstracts from PubMed that contain the keyword “fMRI”
  - We fit a 200-topic statistical model using Bayesian methods
  - provides a full probabilistic model linking topics, words, documents, authors,....
  - A general basis for organizing/exploring text data sets, also for probabilistic query answering
  - Natural extension to include links to gene information
- ◆ Examples of automatically discovered topics: high probability words
  - **Image Acquisition:** echo weighted spin sequences images gradient sequence
  - **Language Modeling:** language left processing speech semantic activation words retrieval tasks
  - **Cortical Regions:** frontal temporal lobe left cortex parietal gyrus occipital regions anterior superior
  - **fMRI Signal:** fmri functional activation stimulation response bold signal cortex level dependent activity
  - **Image Analysis:** images method data registration algorithm reconstruction space error acquired phantom
  - **Cognitive Function:** cognitive memory impairment neuropsychological performance function deficits verbal
  - **Clinical Care:** cost diagnostic care screening health medical physicians quality management costs radiology
  - **Image Models:** models shape surface properties data parameters dimensional results distribution deformation derived geometry
  - **Diagnosis:** diagnosis differential diagnostic clinical considered correct confirmed suspected diagnoses history final suspicion cases signs definitive criteria laboratory
  - **Surgery:** surgical resection removal excision postoperative removed operative cases recurrence operation morbidity

# Trans-disciplinary Example Publications

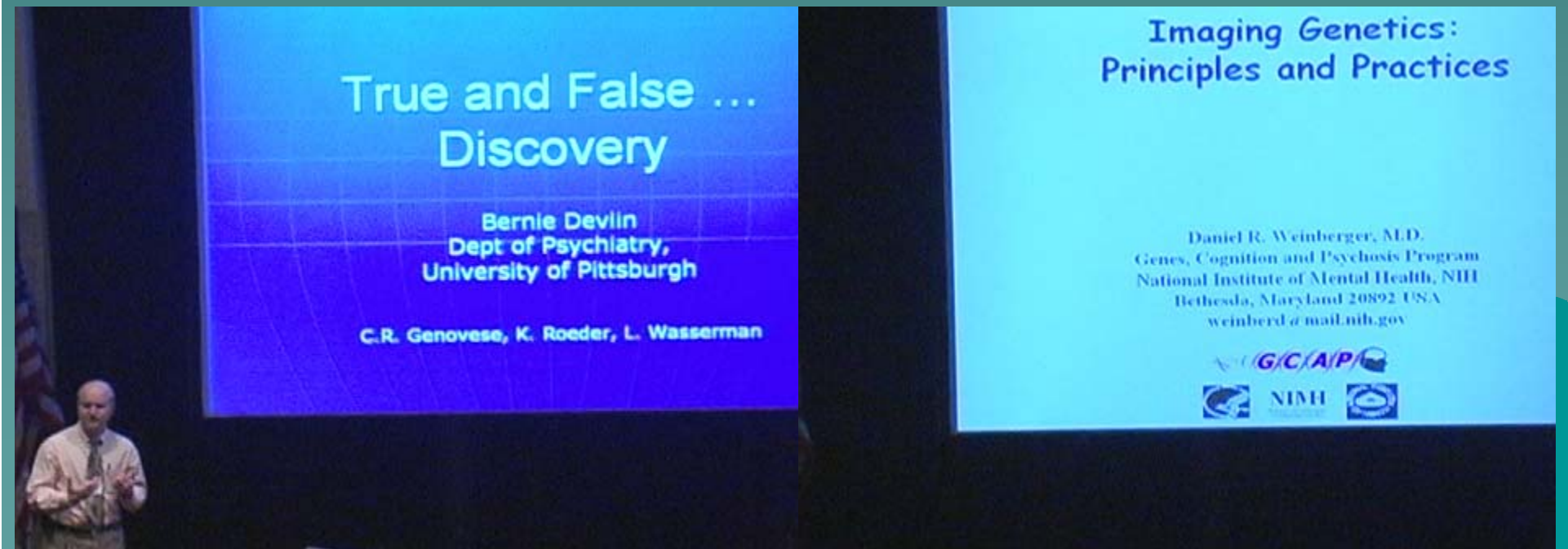
- ◆ Kim, S. Smyth, P., Stern, H., Turner, J., (2005) Parametric response surface models for analysis of multi-site fMRI data. *Proceedings of the 8th International Conference on Medical Image Computing and Computer Assisted Intervention (MICCAI)*. Lecture Notes in Computer Science, Springer-Verlag, Berlin Heidelberg New York, 3749, 352-359.
- ◆ Turner, J., Smyth, P., Fallon, J.F., Kennedy, J.L., Potkin, S.G., FIRST BIRN (2006). Imaging and genetics in schizophrenia. *Neuroinformatics*, in press.

# Roadmap development

- ◆ External Advisory Board: Geneticists, imagers, clinicians, informatics experts
- ◆ EAB meeting: January 2005
- ◆ Roadmap implementation: summer 2005
- ◆ EAB teleconference: September 2005
- ◆ EAB meeting: January 2006
- ◆ Feedback leads to refinement of methods and approaches

# Imaging Genetics Conference

- ◆ The **First** International Imaging Genetics Conference: January 17 and 18, 2005.
- ◆ The **Second** International Imaging Genetics conference: January 16 and 17, 2006.
- ◆ [www.imaginggenetics.uci.edu](http://www.imaginggenetics.uci.edu)





# First and Second International Imaging Genetics Conferences



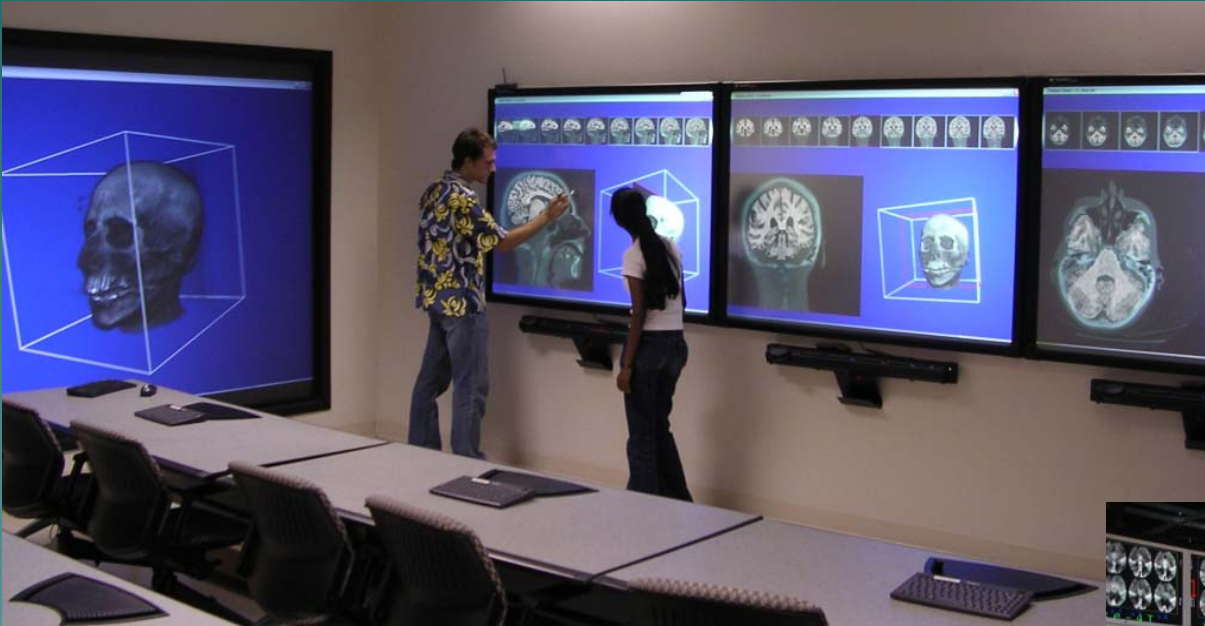






# Preliminary Results: Visual Analytics

VizClass



HPerWall



- Collaboration between on-campus facilities
- Using OptIPuter to Enhance Collaboration
- Enable HCI Research



# Metrics- Walk the Talk?

"Today the Calit2 institute at UCI was visited by two of Governor Arnold's advisors...We did a set of demos in Falko's lab ...

As I was starting my "spiel", with the ...image data behind me (and we also showed the 28 Sz images), the Chancellor walked in to the room (unexpectedly) and sat through the imaging part of the discussion ...

There followed about 15 minutes of very interactive discussion between the 2 folks from Sacramento, the Chancellor, and myself and Falko – ...

I think Falko and I "winged it" pretty well but it was handy to have the Chancellor there to chime in with comments from a medical perspective every now and again ...

I certainly never imagined that I would end up explaining the 5 x 10 "mosaic" of image data to folks at this level!"

